

# Winter Run Life Cycle Model Overview

Workshop I

Morning

June 21, 2017

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**QEDα**



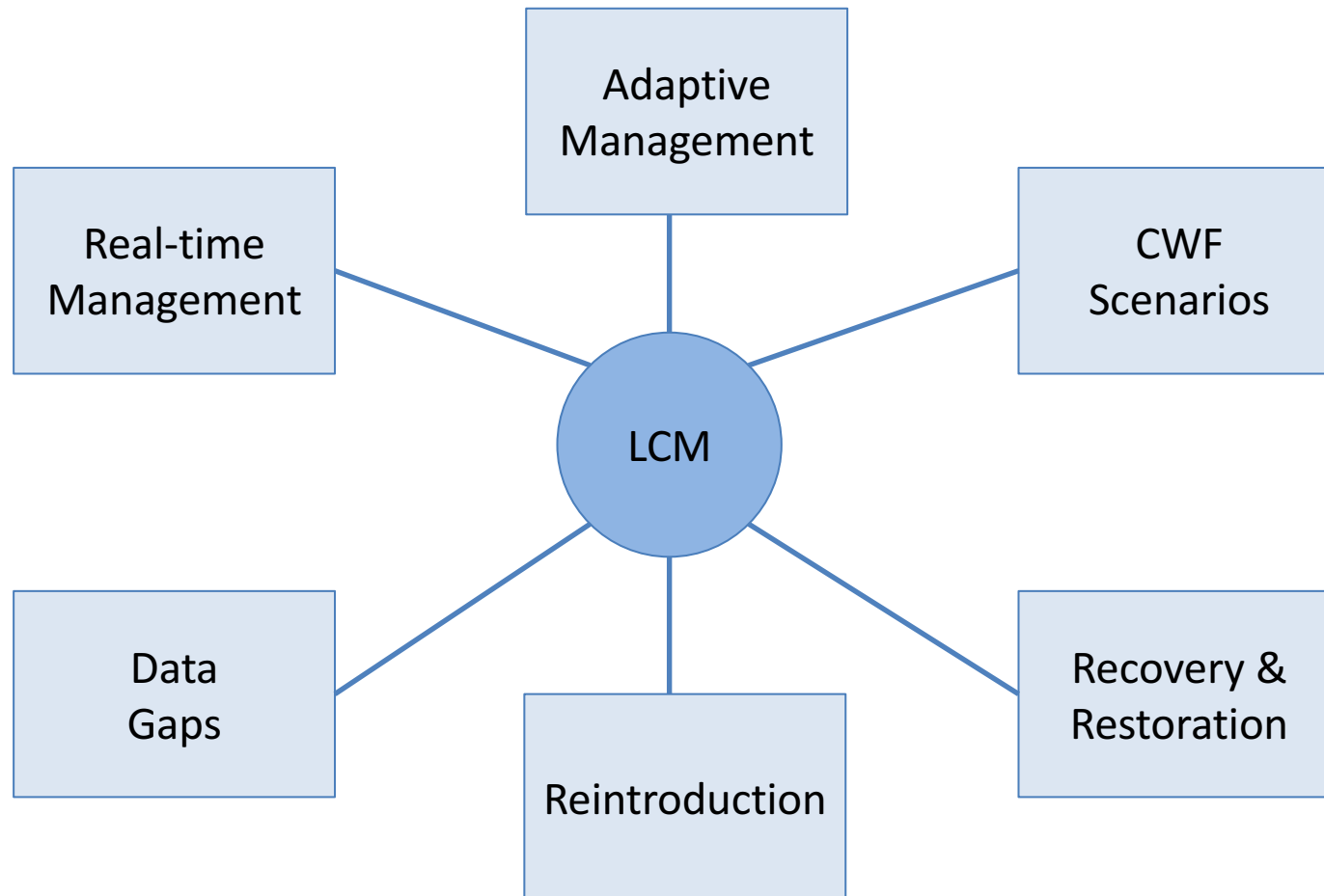
# Overall project goal

The main goal is to build a useful model

G.E.P. Box



# What types of decisions do we want to address?



# Rose et al. 2011 Review

“Critical aspects are: density-dependence, time-stepping, spatial grid, routing into and through the Delta, and ocean growth and survival”

“Consideration of life history variation and spatial distribution is needed”



# Habitat diversity allows expression of different life history strategies in rearing and migration



Slide from Maya Friedman, UCSC & NOAA

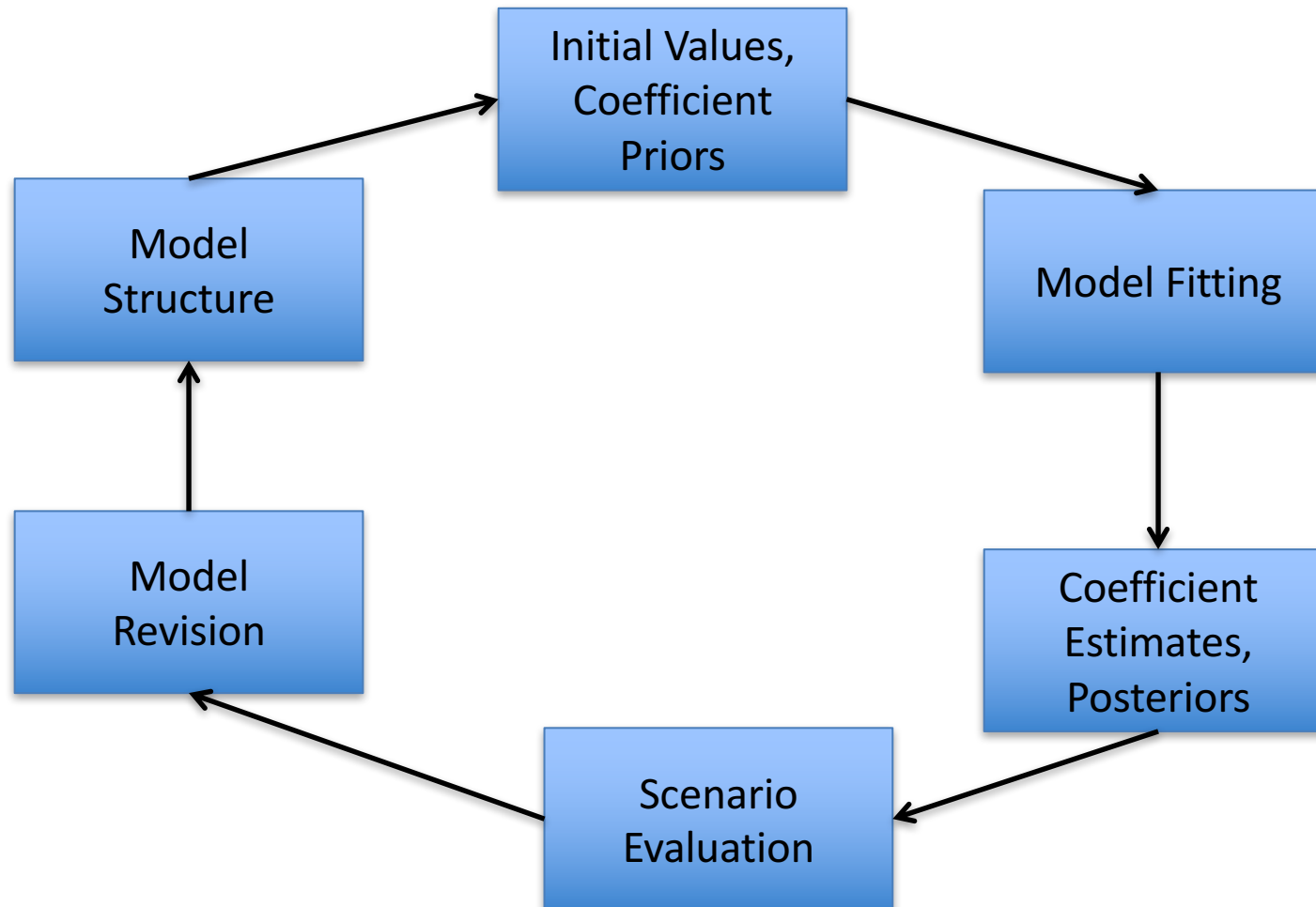
# Useful Model Outputs

1. Specific - can provide specific relationships between population vital rates (e.g., survival or migration) and physical drivers of interest (e.g., flow or temperature)
2. Synoptic - can provide synoptic view of biological consequences of trade-offs
  1. Seasonally – e.g., water allocation in spring versus allocation in summer affects smolt production
  2. Annually – e.g., allocation strategy across different year types affects adult abundance

# **WINTER-RUN LIFE CYCLE MODEL**

# Modeling Steps

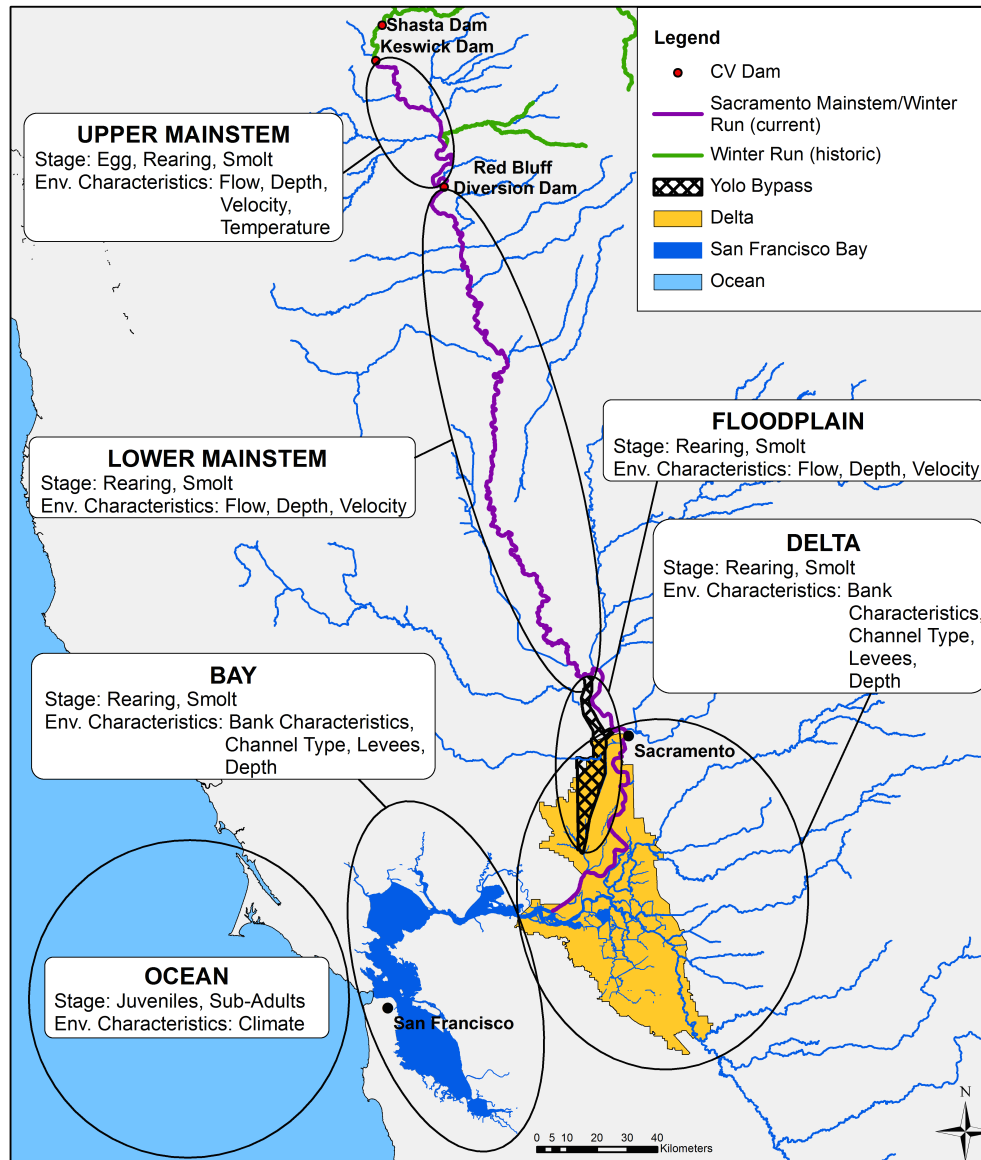
(Currently on Version 1.4.2)



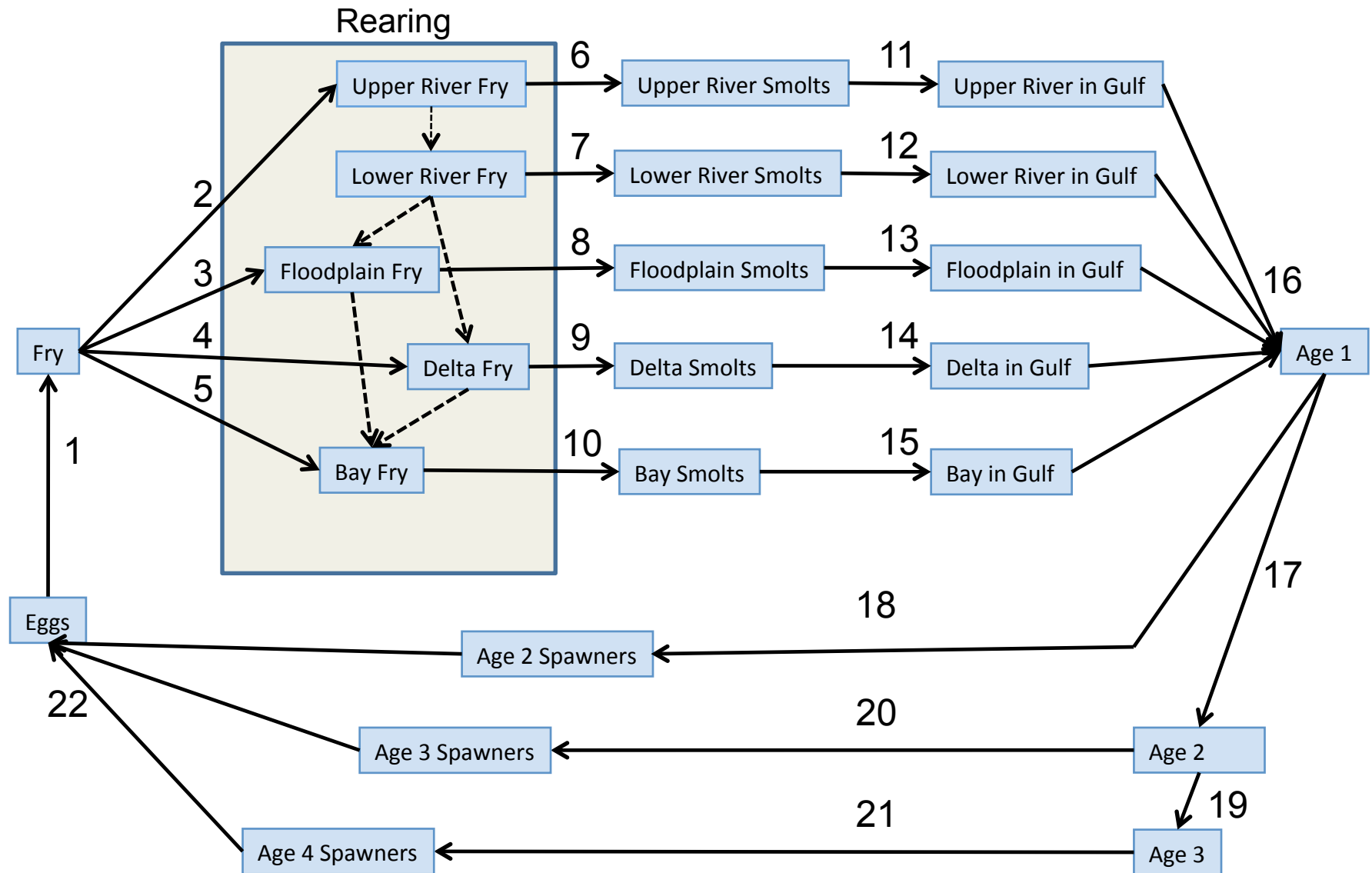
# Timeline of WRLCM development

- 2012
  - Workshops – feedback on model structure, data availability, biological mechanisms
  - Evaluate Shiraz – reject Shiraz
  - Build prototype models in SLAM – reject SLAM
- 2013
  - Build initial models in R
  - Revise models in R
  - More workshops for biological review and data discussion
- 2014
  - Finalize Version 1.0 – a proof of concept
  - Use V 1.0 to evaluate climate scenarios
- 2015
  - Revise model to V 1.2
  - Center for Independent Experts model review: 1) split River habitat and 2) add process noise to make state-space
- 2016
  - More revisions, add annual random effects
  - Model ‘fixed’ for evaluating actions
  - Scientific Panel Review of WRLCM for Cal Water Fix

# Spatial Structure



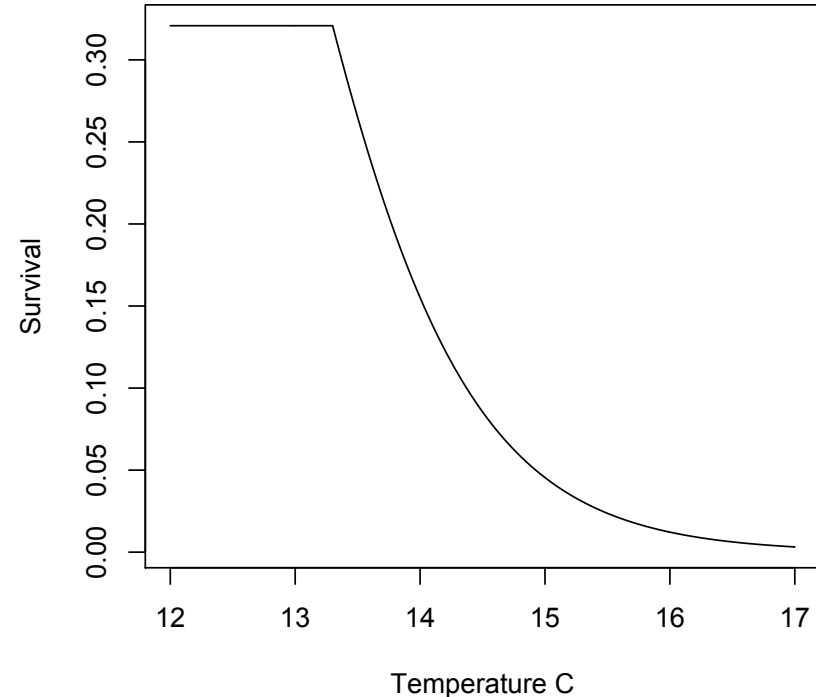
# WRLCM Diagram



# Change-point model for thermally induced egg mortality

- Below a temperature threshold ( $t.crit$ ) survival is stable
- Above  $t.crit$ , survival can decrease via a logistic regression

Hypothetical Relationship

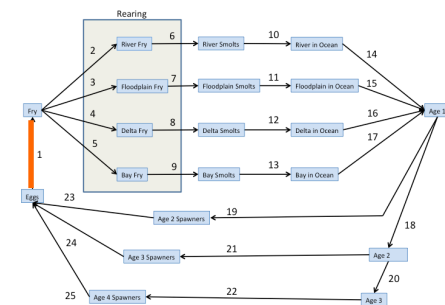


Survival from Egg to Fry stage

$$Fry_{m+2} = Eggs_m * S_{eggs, m}$$

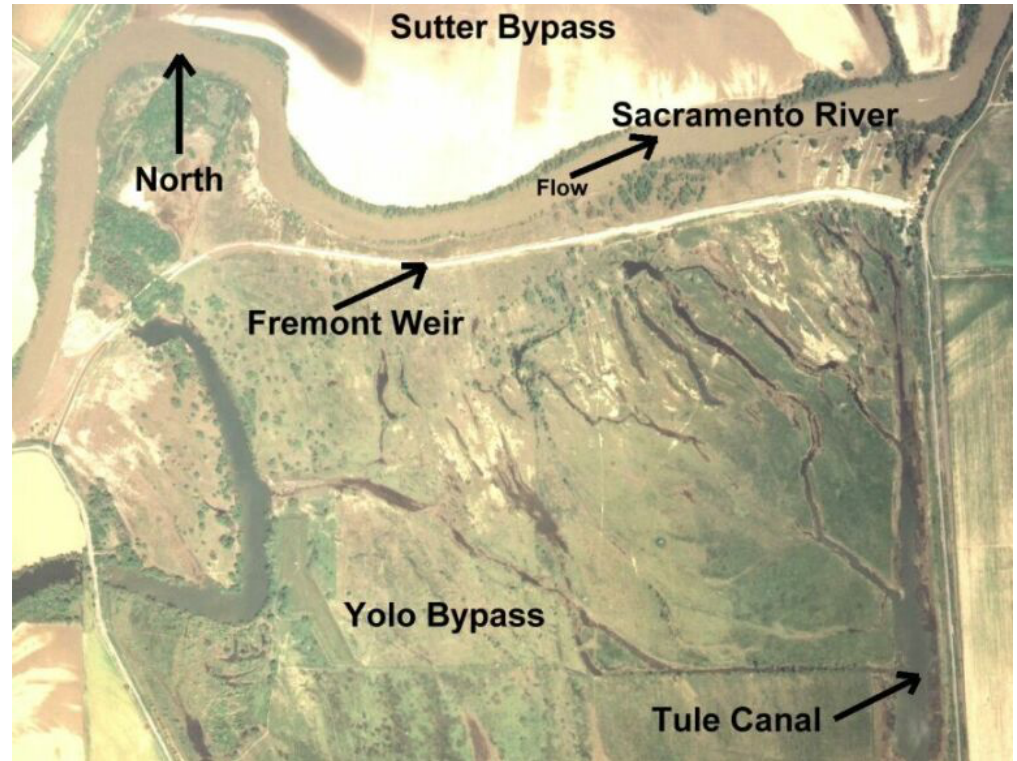
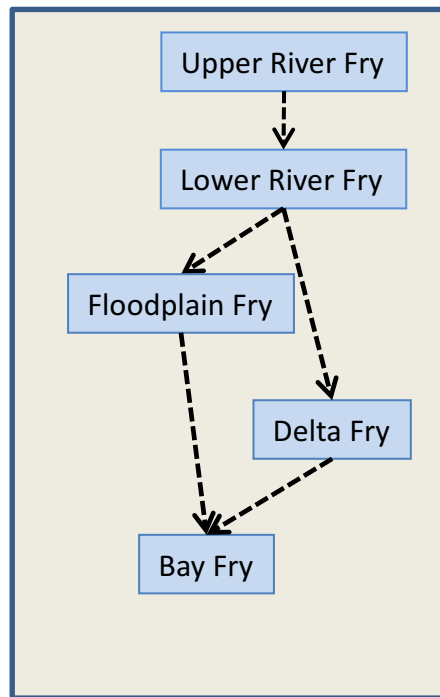
$$logit(S_{eggs, m}) = \begin{cases} B0_1, & TEMP \leq t.crit \\ B0_1 + B1_1(TEMP_m - t.crit), & TEMP > t.crit \end{cases}$$

$TEMP_m$  = 3 month average temperature post spawning temperature threshold





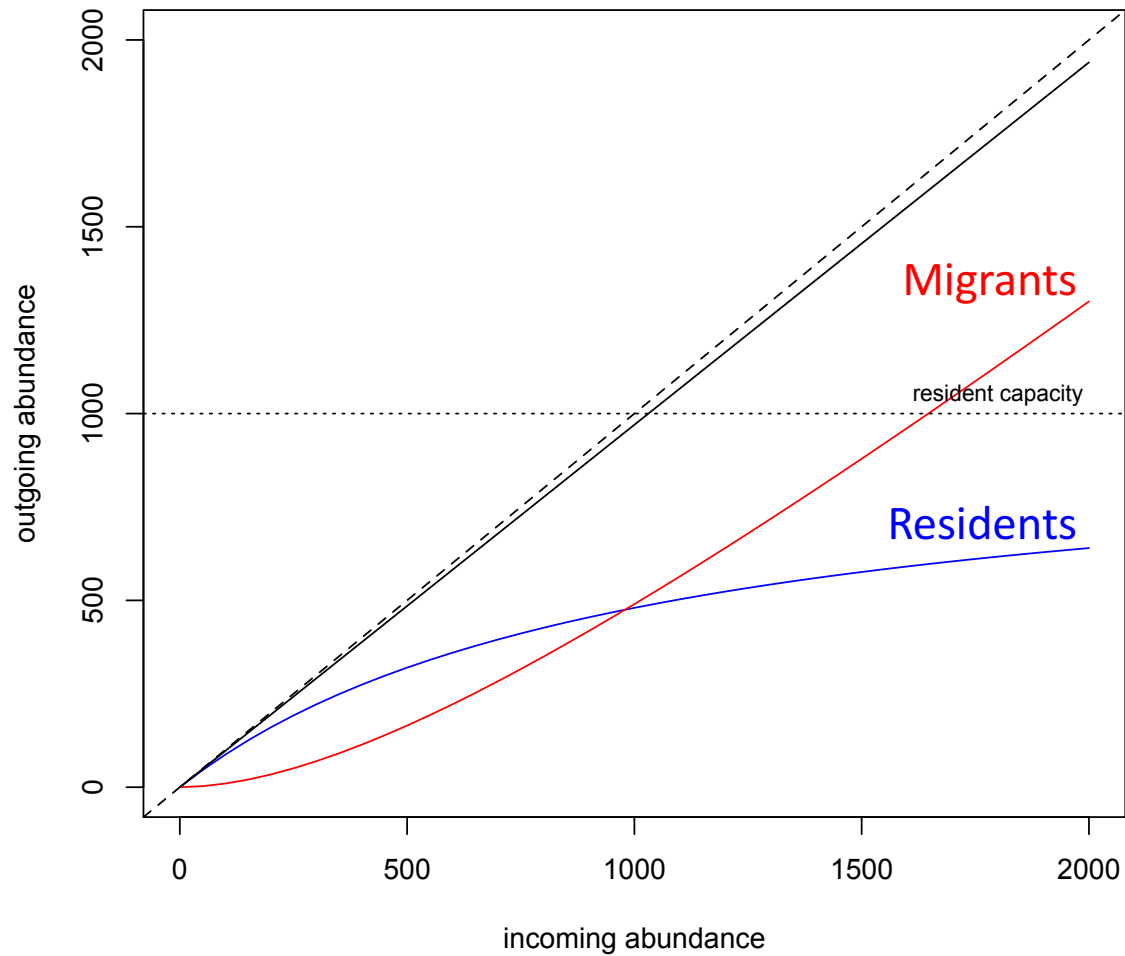
# Spatial Linkages



Credit: T. Endreny SUNY

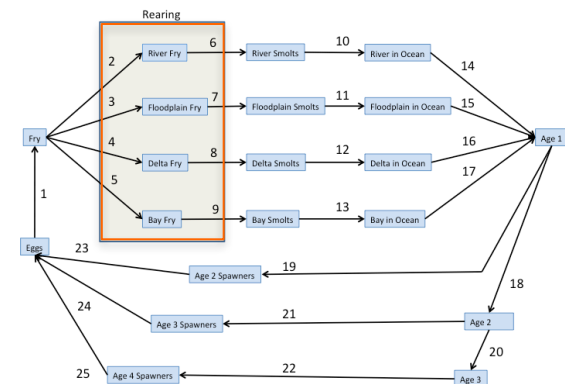
Fry can enter into Floodplain habitat only when there is flow into Yolo Bypass

# Fry Rearing Movement Function



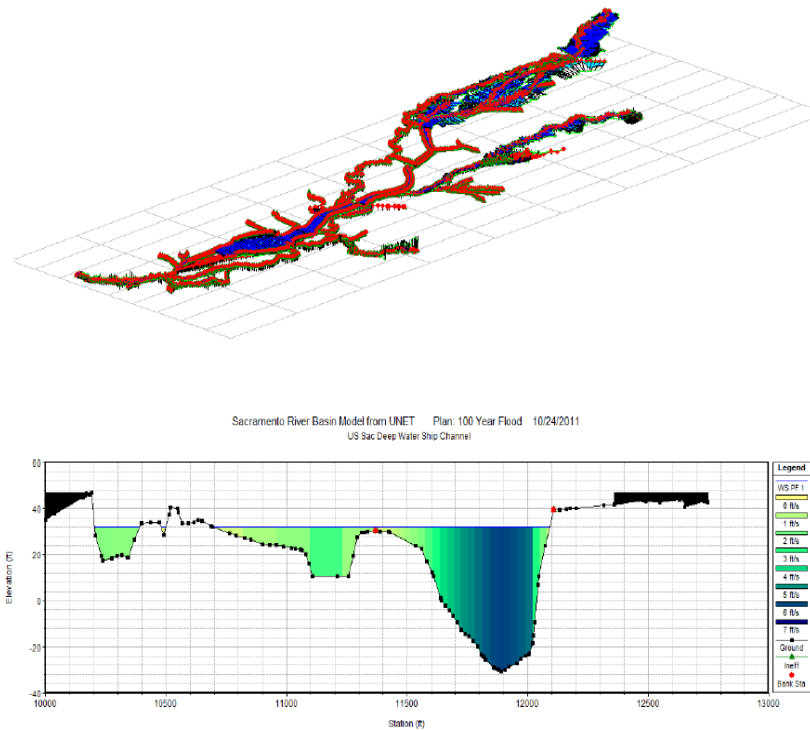
$$\text{Resident}_{h,m} = \frac{S_{h,m}(1 - mig_{h,m})N_{h,m}}{1 + S_{h,m}(1 - mig_{h,m})N_{h,m} / K_{h,m}}$$

$$\text{Migrant}_{h,m} = S_{h,m} N_{h,m} - \text{Resident}_{h,m}$$

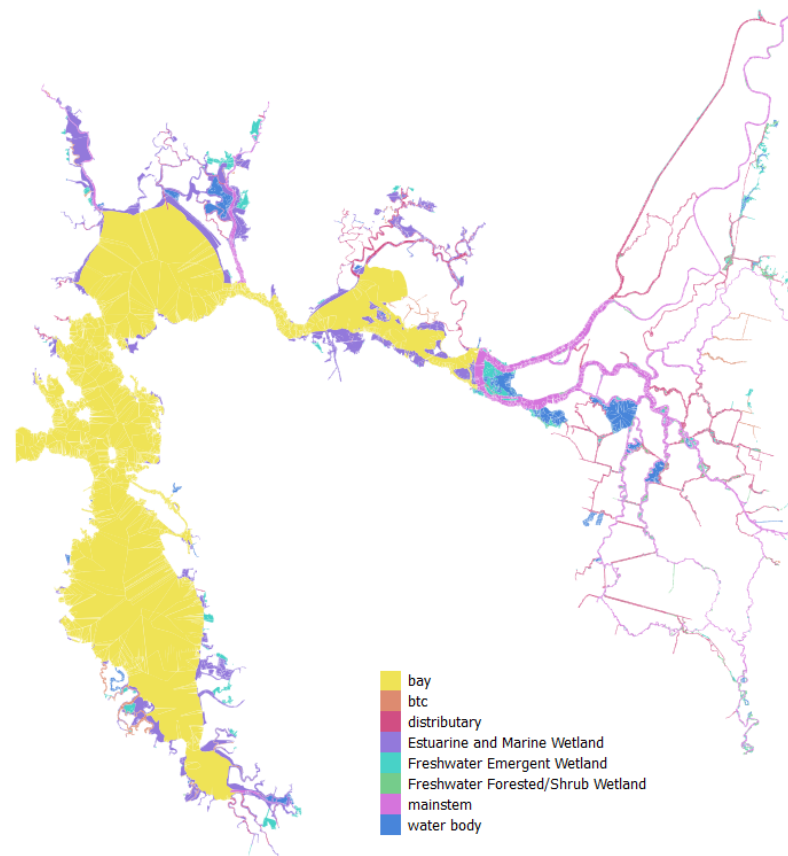


# Habitat capacity

HEC-RAS modeling for obtaining preference categories in River habitats



GIS modeling for obtaining preference categories in Delta and Bay habitats



# Smoltification

Probability of smolting  $P_{smolt}$  is modeled as a proportion ordered logistic regression

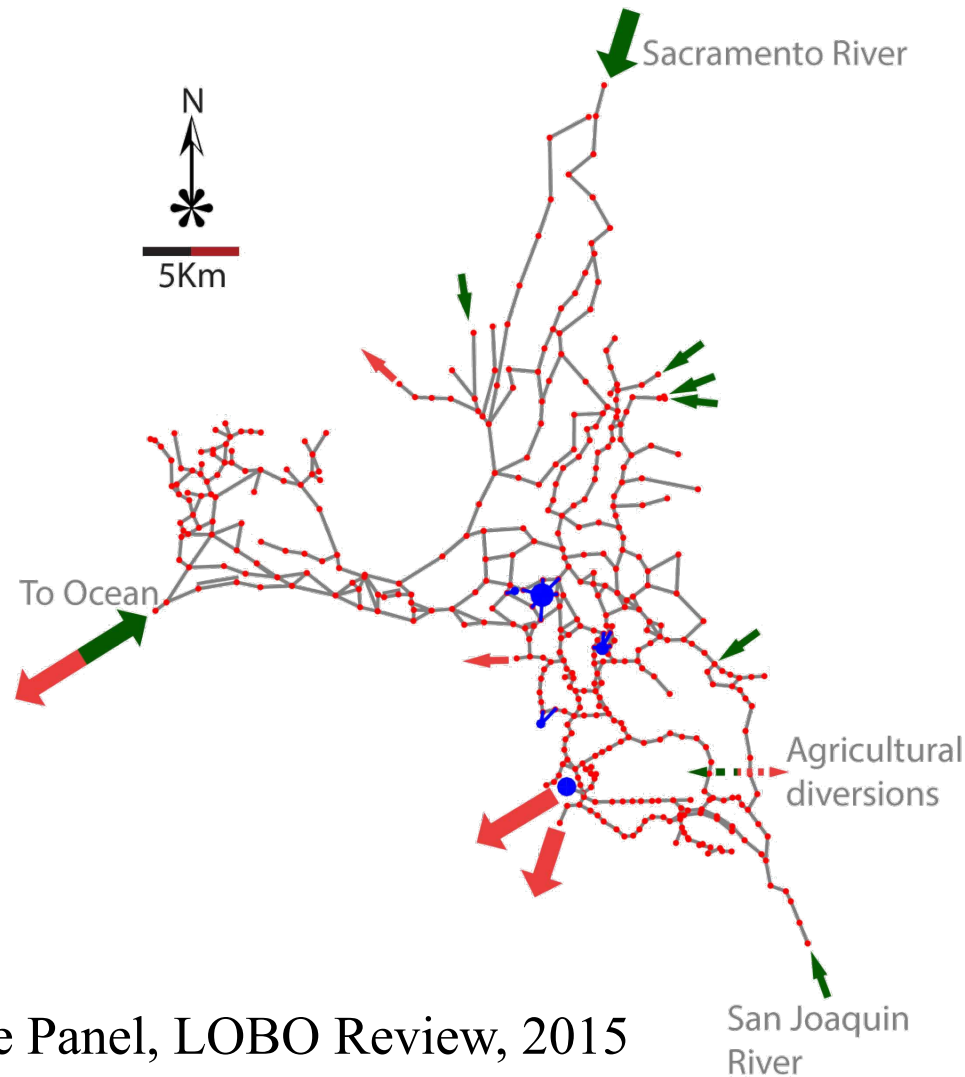
$$\text{logit}(P_{smolt, m}) = Z_k$$

where  $-\infty < Z_1 < Z_2 \dots < Z_k < \infty$  are the monthly rates of smoltification based on photoperiod ( $k = 1, \dots, 7$  encompassing January to July).



Credit: [salmonguy.org](http://salmonguy.org)

# Smolt survival using Enhanced Particle Tracking Model (ePTM)



Source: Delta Science Panel, LOBO Review, 2015



# Reaching the Ocean

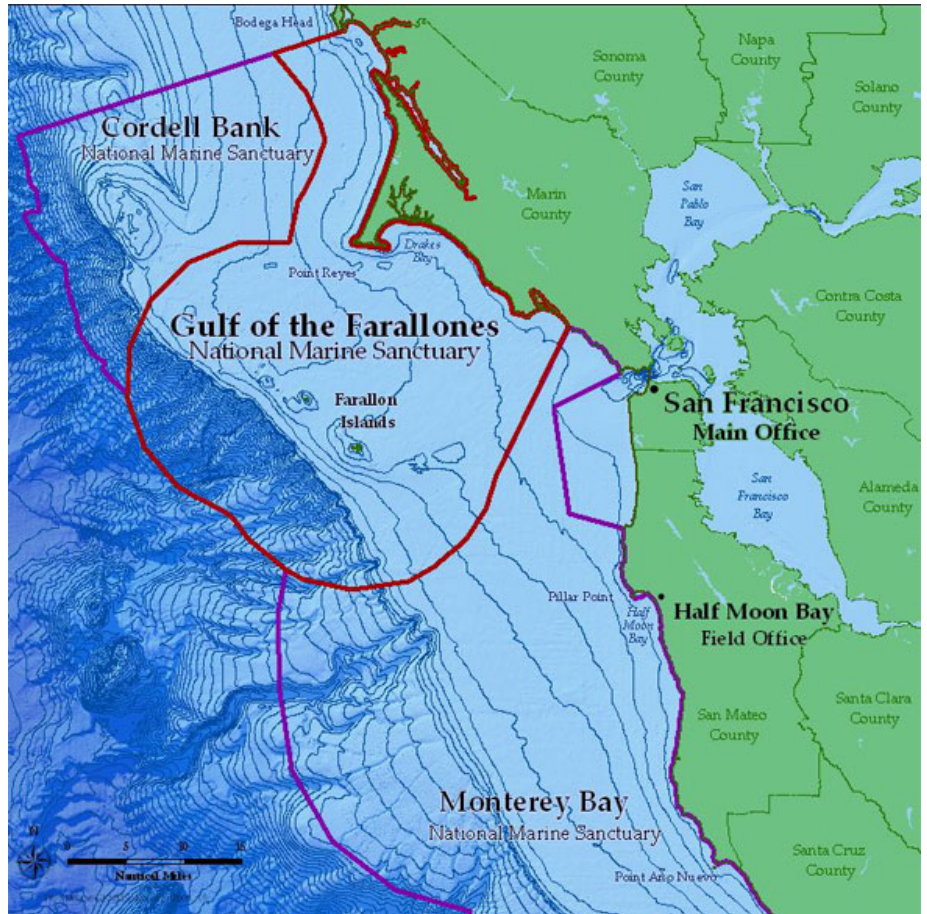
Gulf of Farallones stage –

$$Gulf_{h,m} = Smolt_{h,m-1} S_{smolt,h,m-1} \exp(\varepsilon_y)$$

$$S_{smolt,h,m-1} = f(ePTM_{h,m-1})$$

$$\varepsilon_y \sim N(0, \sigma_\varepsilon^2)$$

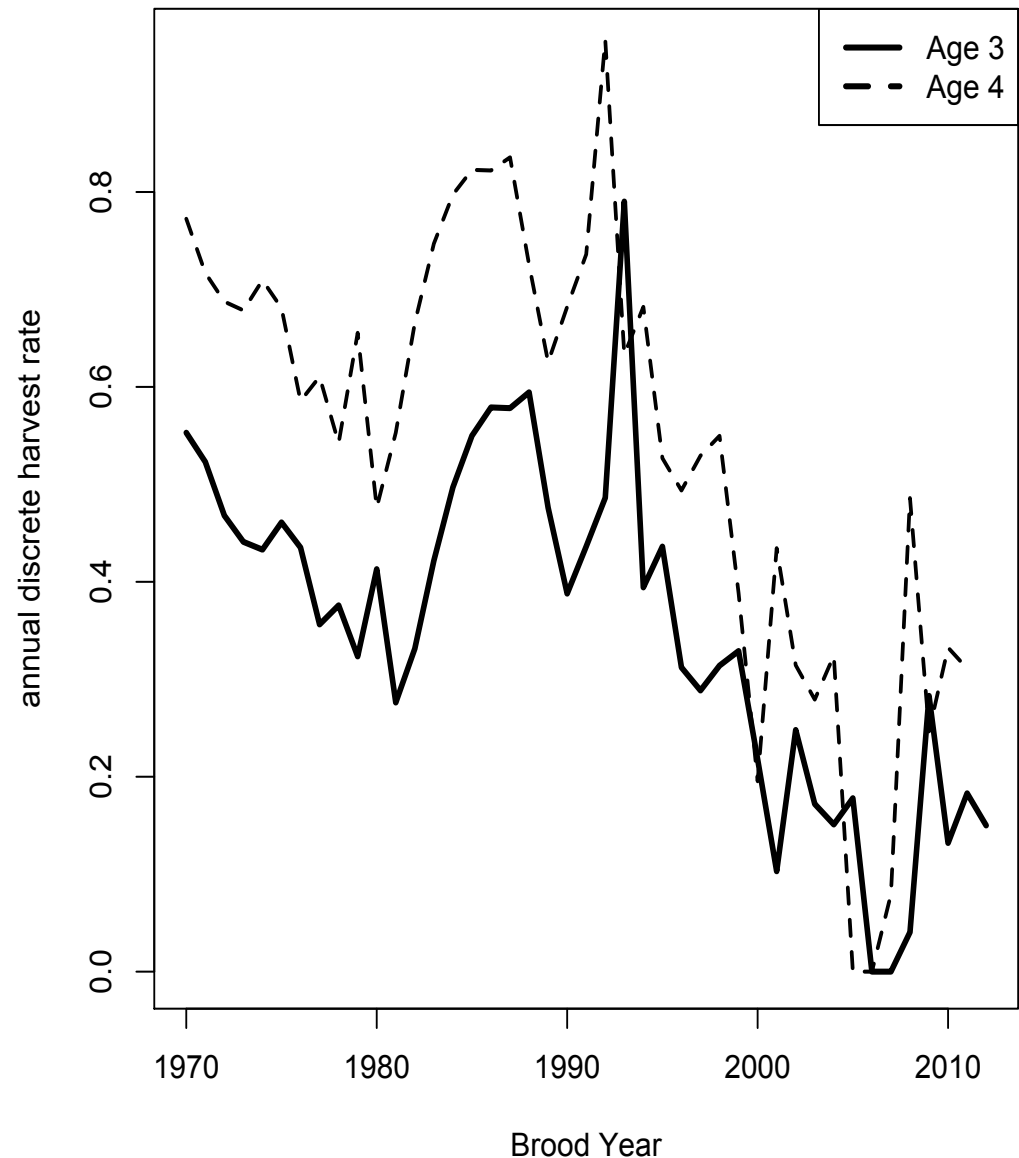
Where  $S$  is the survival in habitat  $h$ , in month  $m$ , and year  $y$ , and  $\varepsilon_y$  is the annual random effect



Credit: NOAA

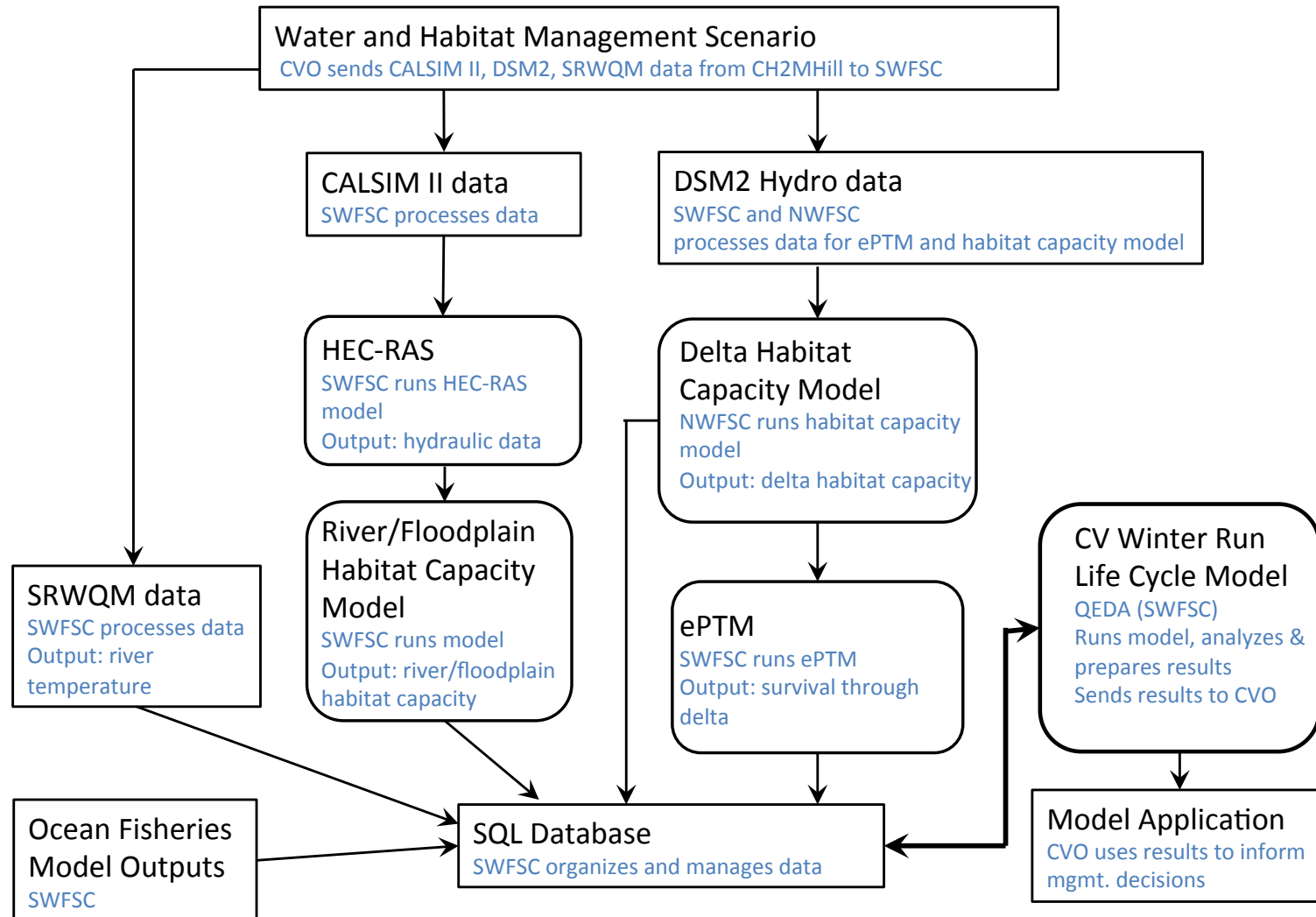
# Ocean survival, harvest, maturation

- Age 2 NM: 0.5
- Age 3 NM: 0.8
- Age 4 NM: 0.8
- Age 3 and 4 vulnerable to fishery
- Variable age-3 and age-4 impact historically
- Dominant age 3 maturation  $\sim 0.9$



# WRLCM Model Linkages

## Central Valley Winter Run LCM Model Linkages





# Physical drivers

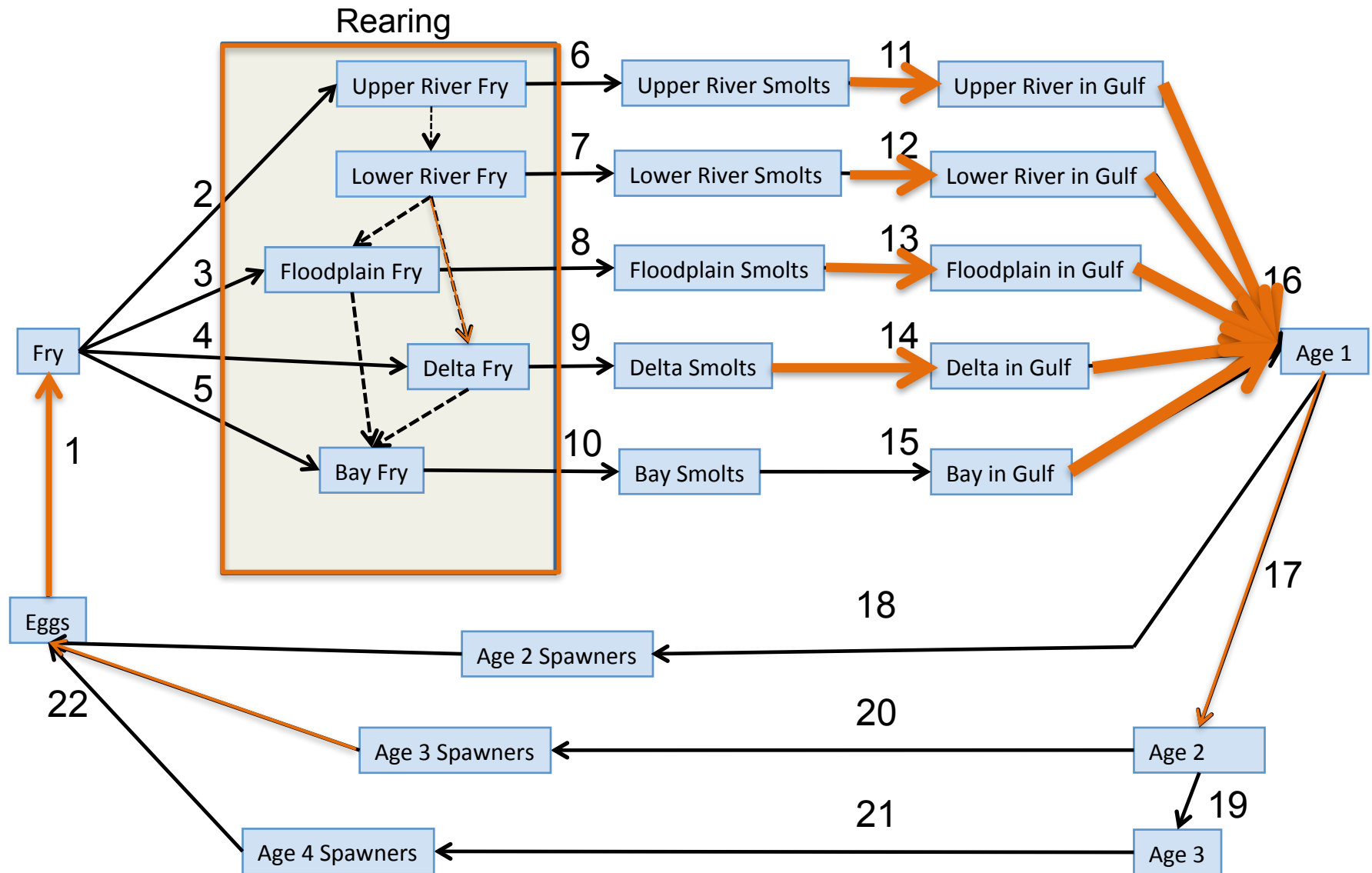
- Temperature at Keswick
  - Egg to Fry Survival (Apr – Oct)
  - Spawn timing (Apr)
- Fremont Weir Spill
  - Yolo entrance probability
- Flow at RBDD
  - Smolt survival
- South Delta Exports
  - Smolt survival
- Flow at Wilkins Slough
  - Movement Lower River to Delta

**CALIBRATION**

# Model fitting (calibration)

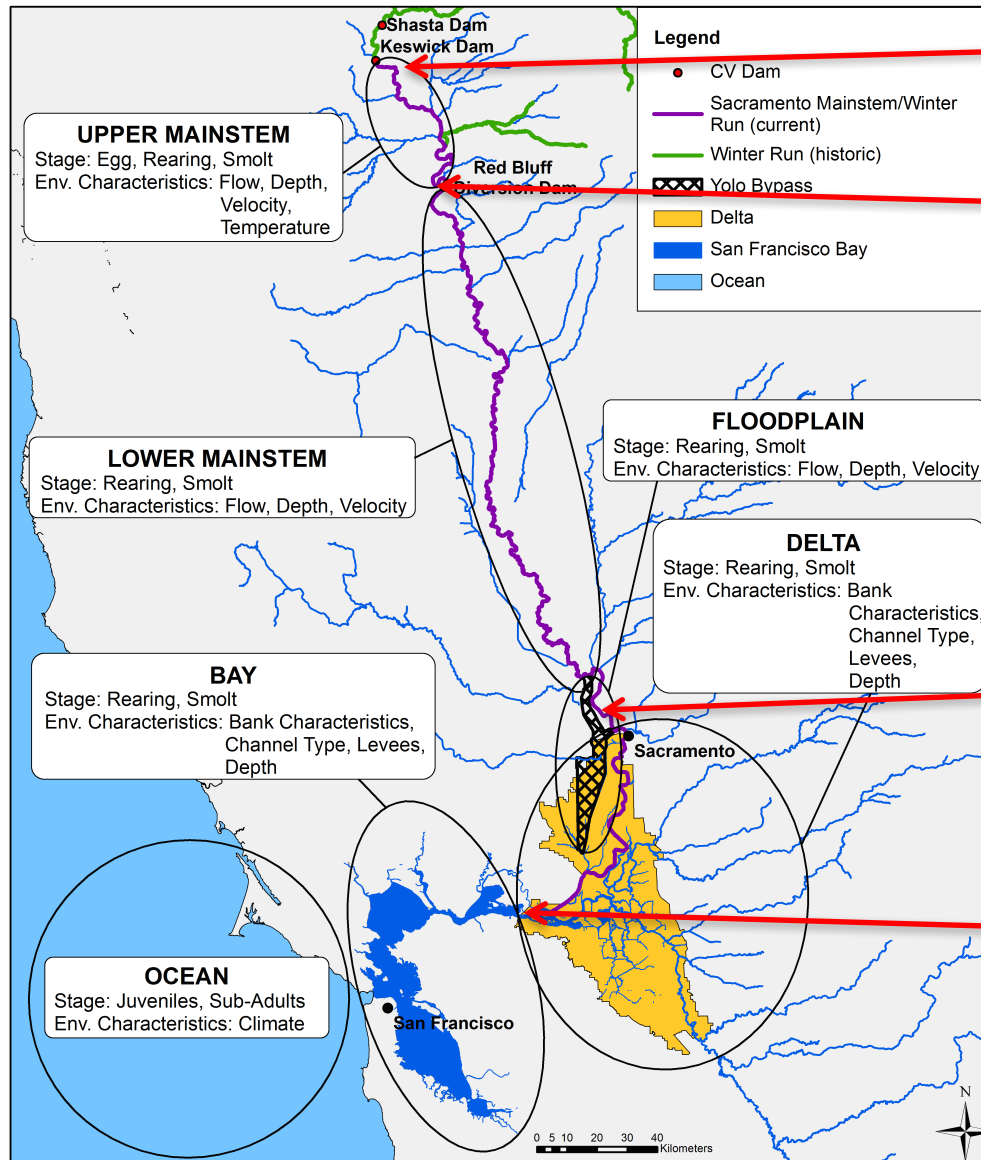
- Potential difficulties with estimation
  - Structurally - not formulated for estimation
  - Parameter space ( $\sim 60$  parameters) so a bit over-parameterized
  - Temporal (monthly) and spatial domain (5 regions) are not well represented via survey data
  - Expect identifiability issues and high correlations among parameters
  - Estimate annual random effects and process noise distribution

# Cohort Replacement Rate Sensitivity



# WRLCM Calibration

## Indices of Abundance



Spawners

Juveniles at  
RBDD

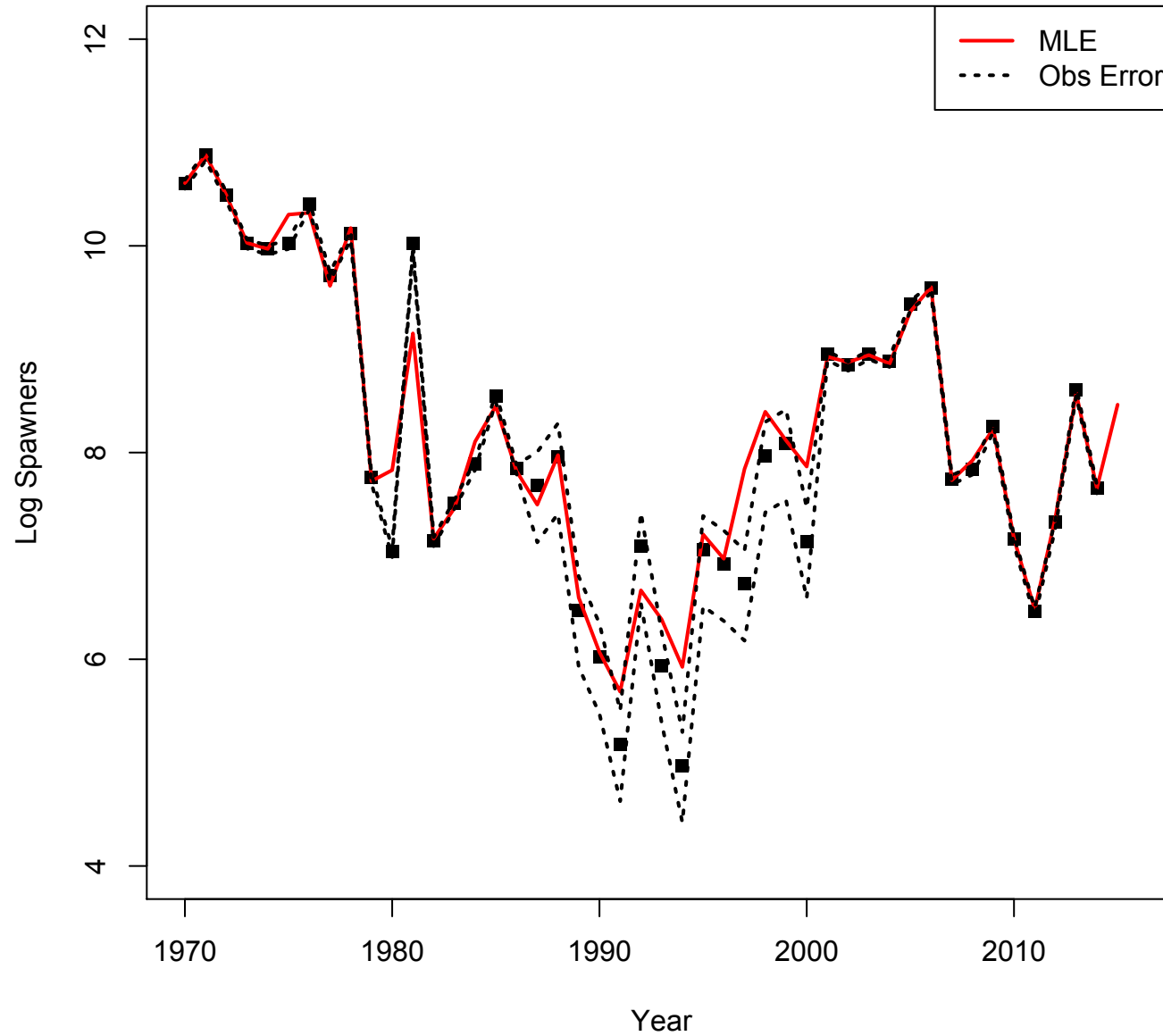
Knights Landing  
catch

Chipps Island  
abundance

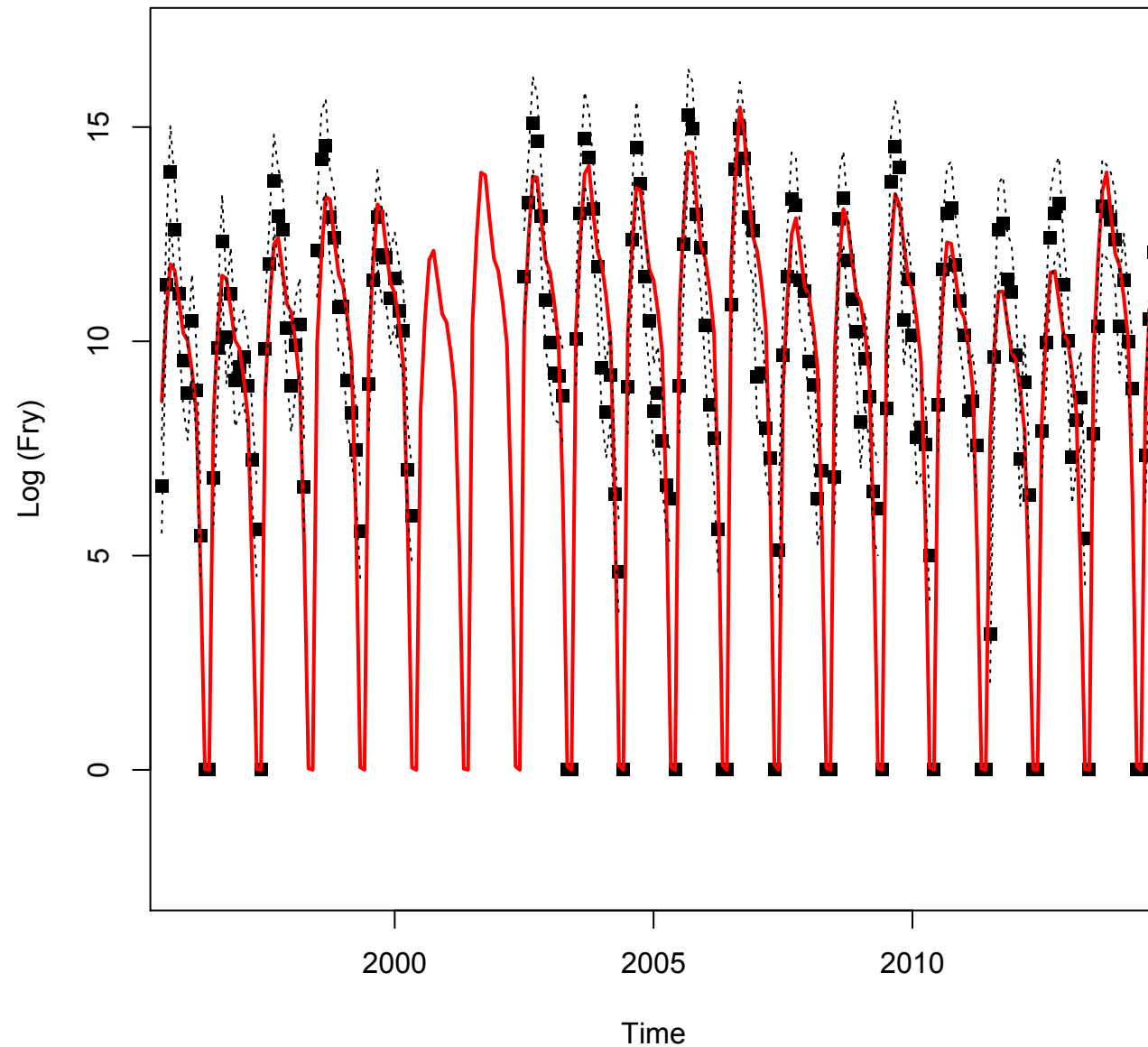
# Indices of abundance

| Data                                      | Date                 | Coefficient of Variation                                | Sampling Distribution | Data time step |
|---|----------------------|---|-----------------------|----------------|
| Natural Escapement                        | 1970-2014            | 0.15 (1970-1986)<br>0.5 (1987-2000)<br>0.15 (2001-2014) | lognormal             | Annual         |
| RBDD monthly juvenile counts              | 1996-1999, 2002-2014 | 0.85  | lognormal             | Monthly        |
| Knights Landing monthly catches           | 1999 - 2008          | NA  | multinomial           | Monthly        |
| Chippis Island monthly juvenile abundance | 2008 - 2011          | 1.5   | lognormal             | Monthly        |

# Natural origin log spawners

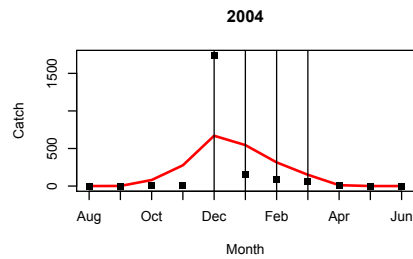
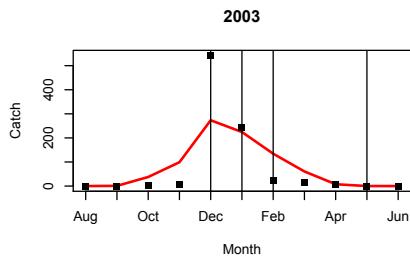
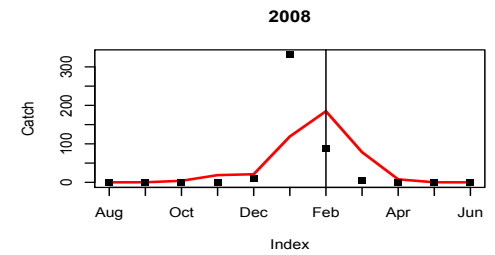
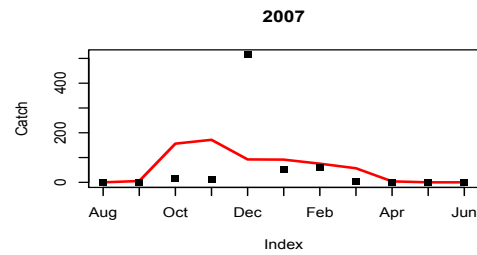
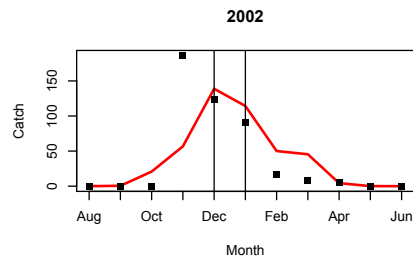
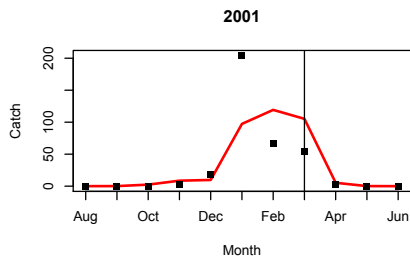
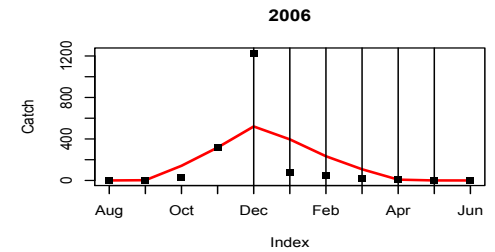
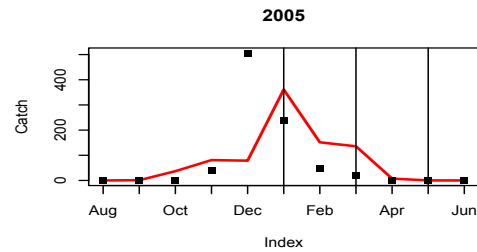
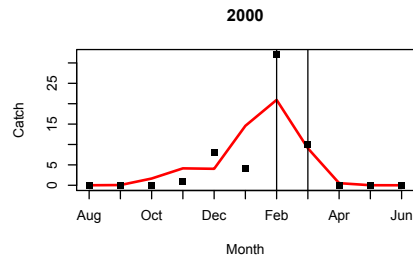
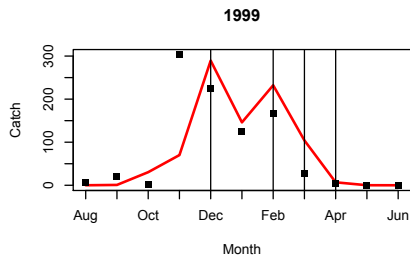


# Monthly juvenile log abundance

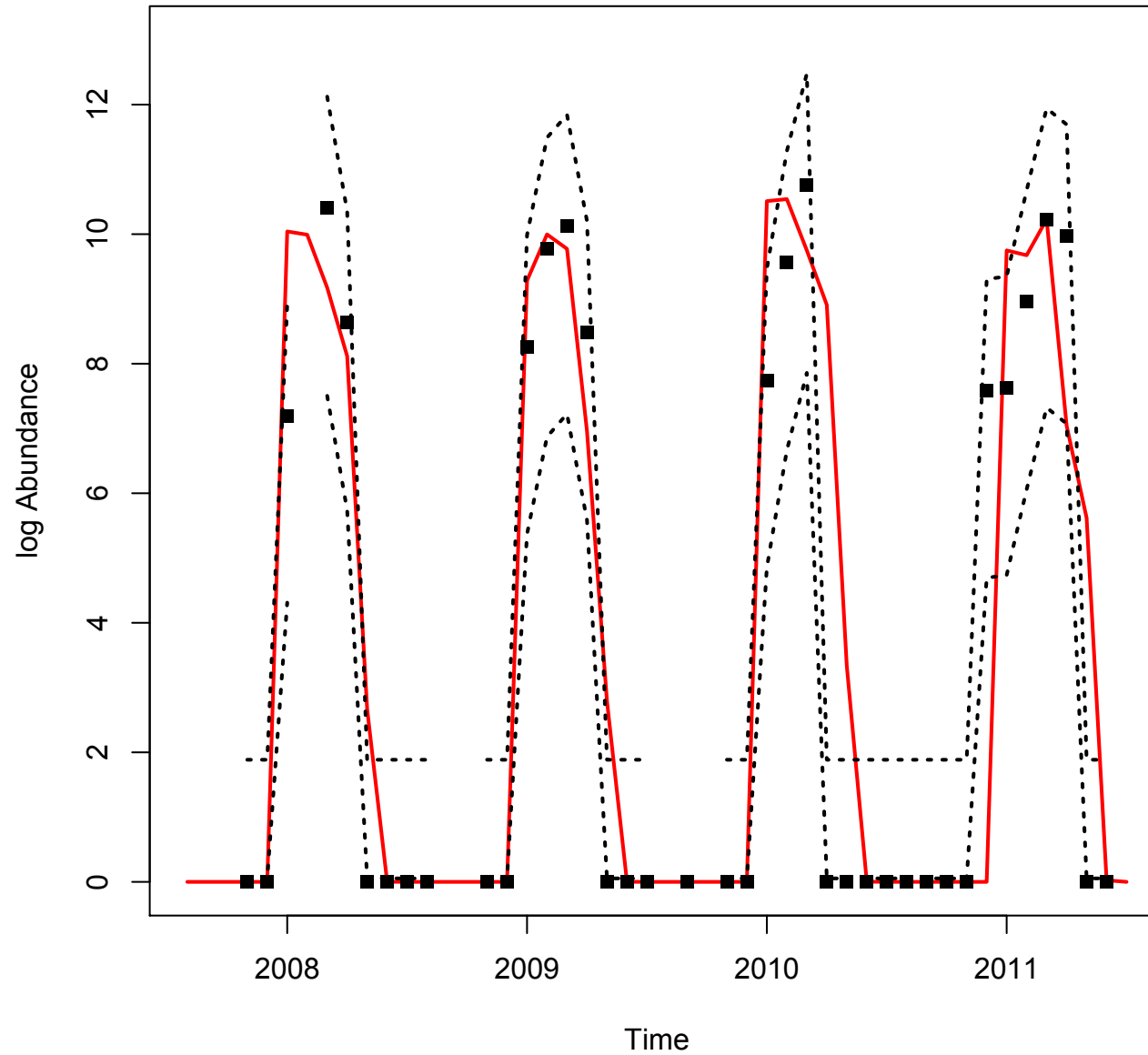




# Knights Landing catch



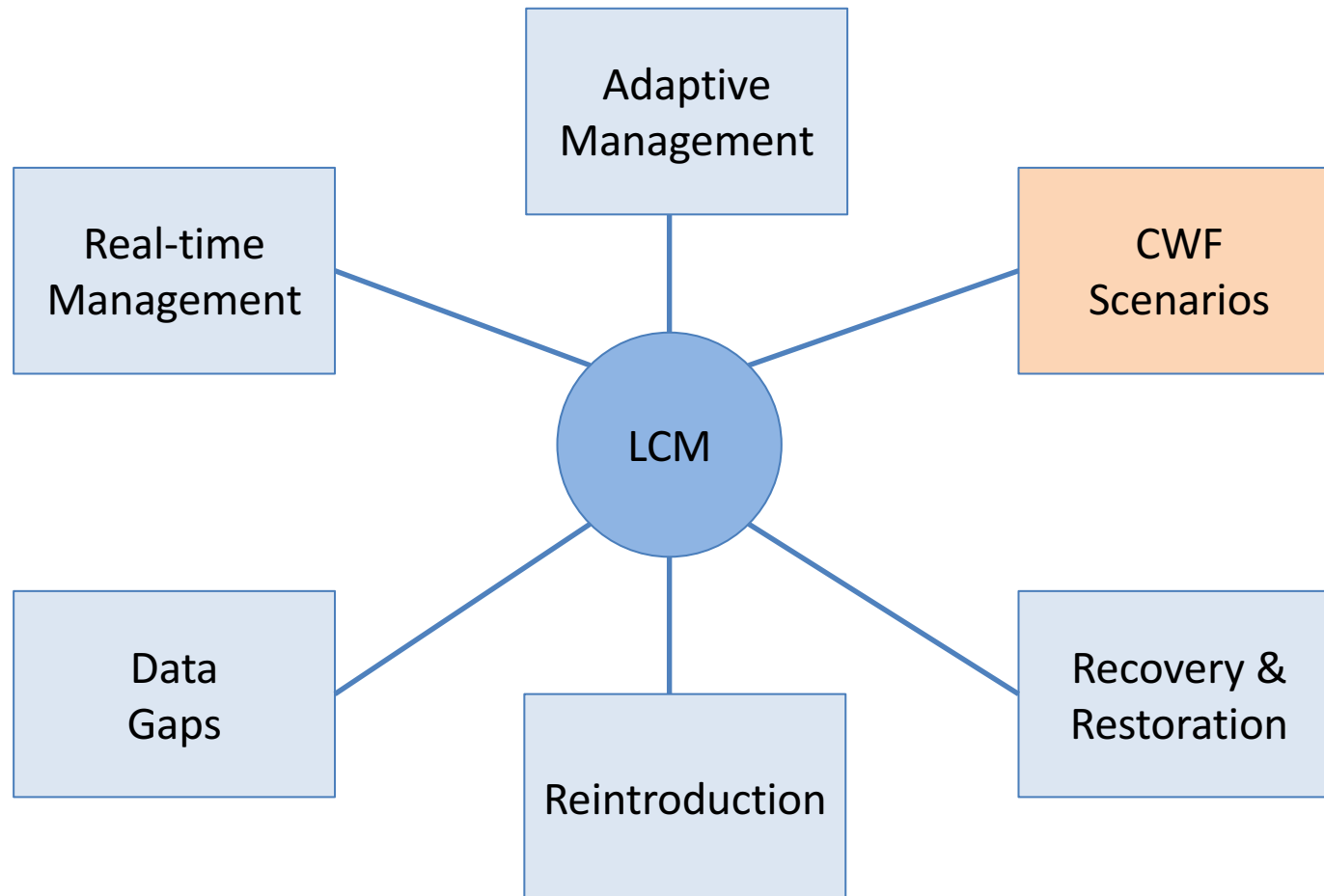
# Chippis Island log abundance



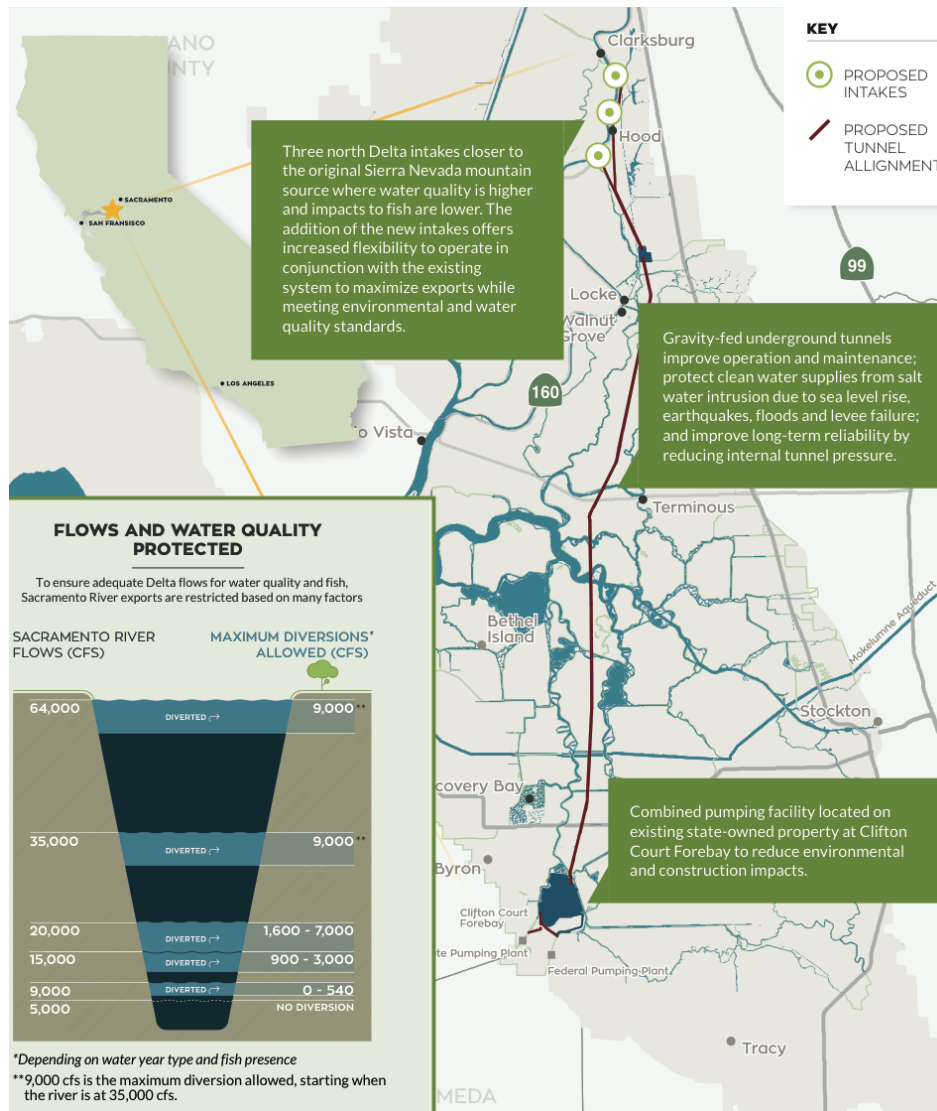
# Inference from statistical fitting (Calibration)

- Temperature during April can affect spawn timing (higher temperatures lead to later spawning)
- Spatial distribution in rearing is affected by physical drivers and density dependence
  - Movement out of Lower Sacramento due to flow pulse at Wilkins Slough  $> 400 \text{ m}^3\text{s}^{-1}$
  - Movement to Delta also occurs under higher fry abundance
- ePTM results support Delta as poor place to smolt relative to Sacramento River or Yolo bypass

# What types of decisions do we want to address?



# California Water Fix

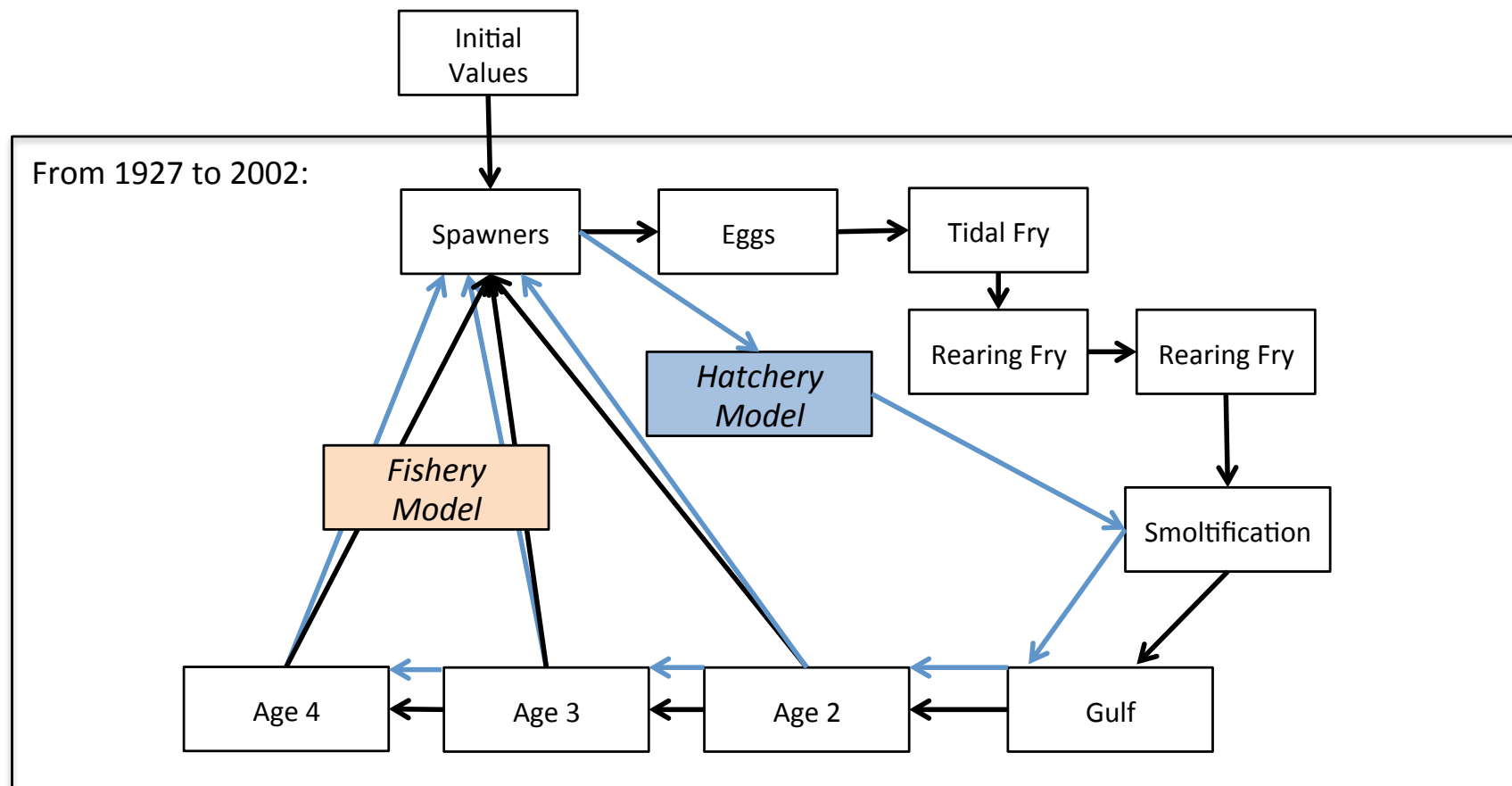


- North Delta Diversions (NDD) to provide water to south Delta pumps
- Exports via NDD and/or south Delta depending on water year type

<https://www.californiawaterfix.com/resources>

# Simulation steps for Cal Water Fix

From 1922 to 1926:



# WR LCM Action Evaluations

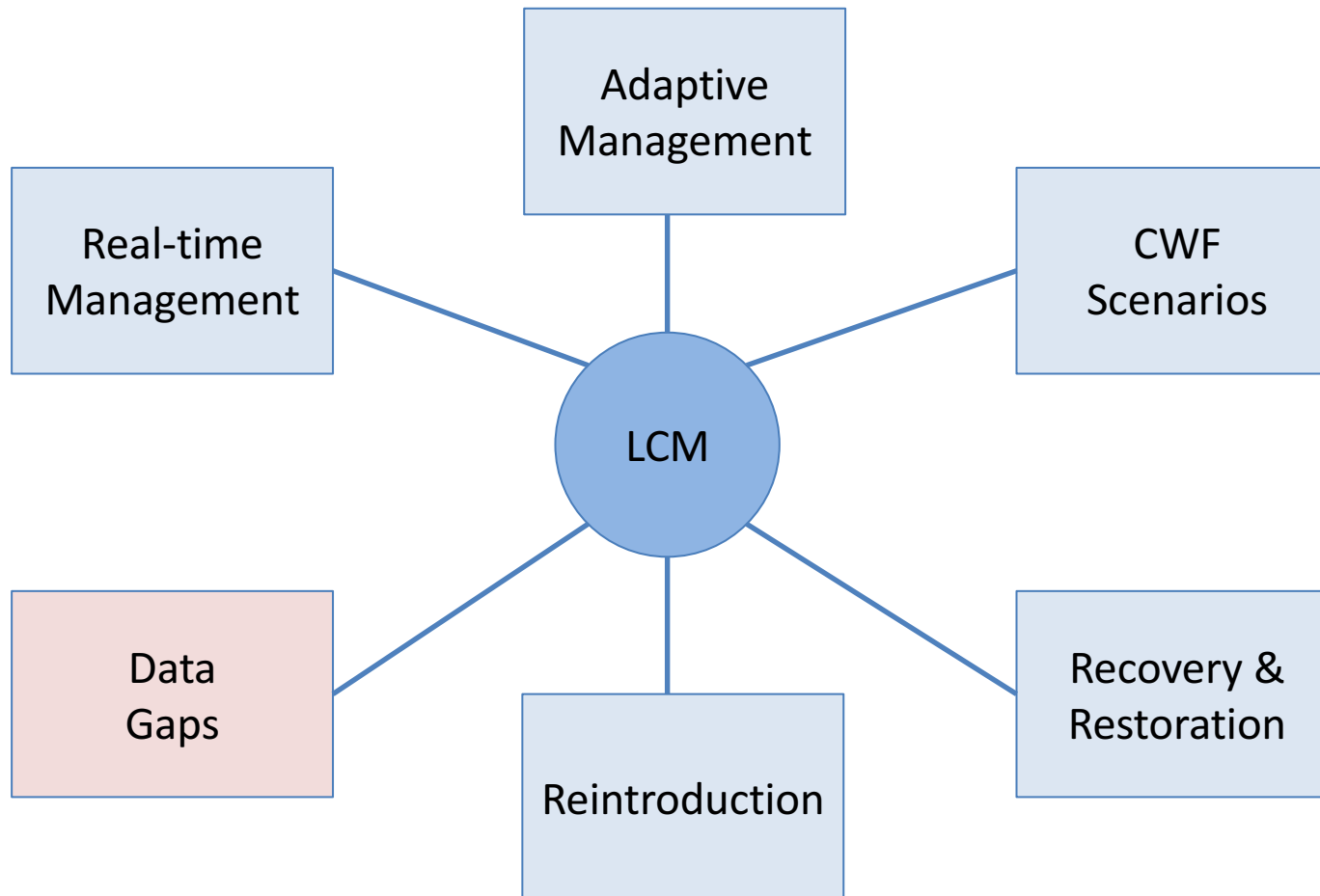
Use Monte Carlo simulation:

1. Run the Base Action under a single 'state of nature' or parameter set
2. Run the Alternative action under the same state of nature
3. Calculate relative performance  $[(\text{Alt} - \text{Base})/\text{Base}]$
4. Repeat over multiple states of nature
5. Summarize relative performance over multiple states of nature

Stanislaw Ulam



# Data Limitations



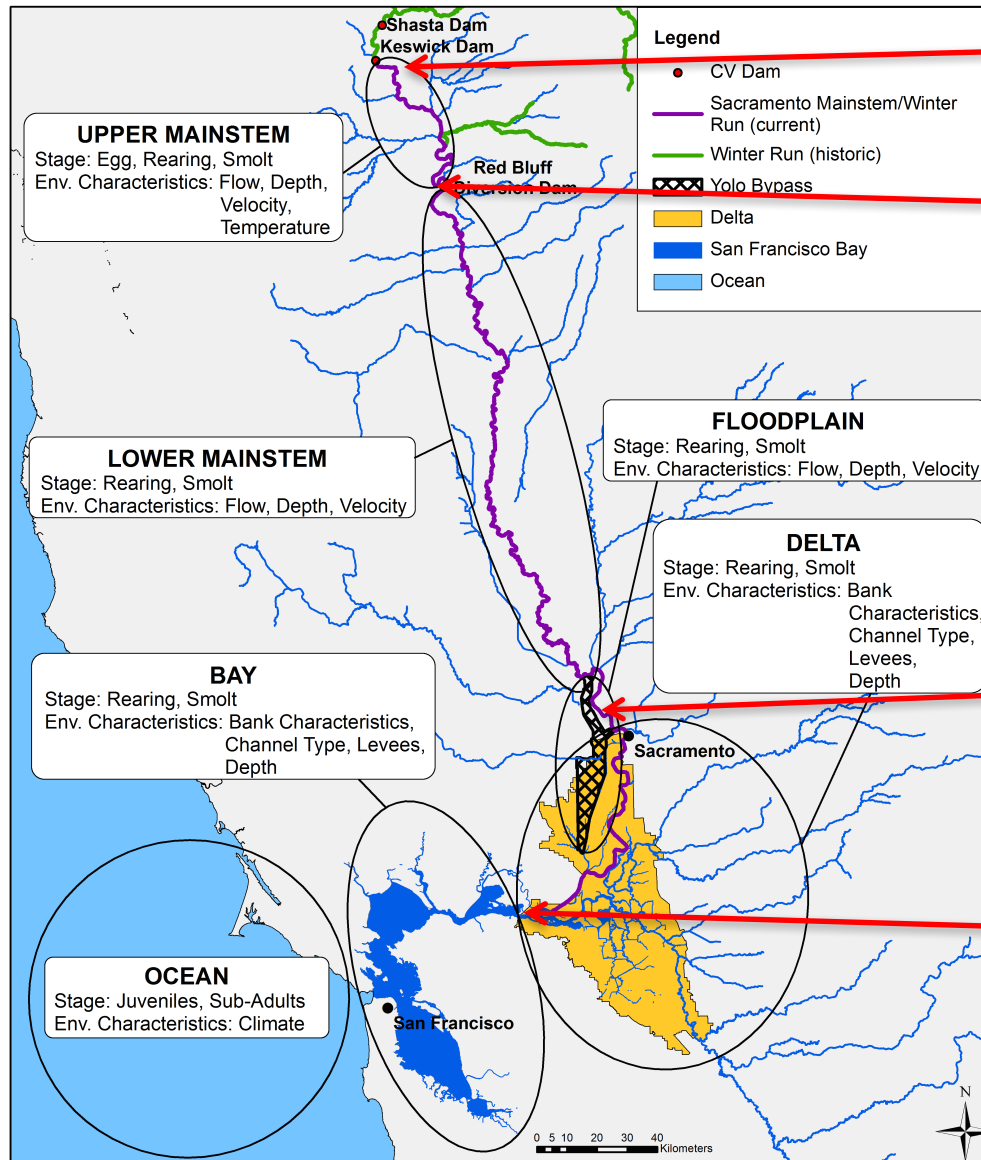


# Data limitations

Limitations in available data require making assumptions in the model structure:

- Fry survival is equivalent across all months and habitats
- Timing and proportion of winter run entering the delta are informed by Knights landing catches of WR sized fish
- SAIL recommendations
  - “A robust monitoring network that provides quantitative information about the status of imperiled species at key life stages and geographic locations...”

# Evaluate Monitoring



Spawners

Juveniles at  
RBDD

Knights Landing  
Abundance

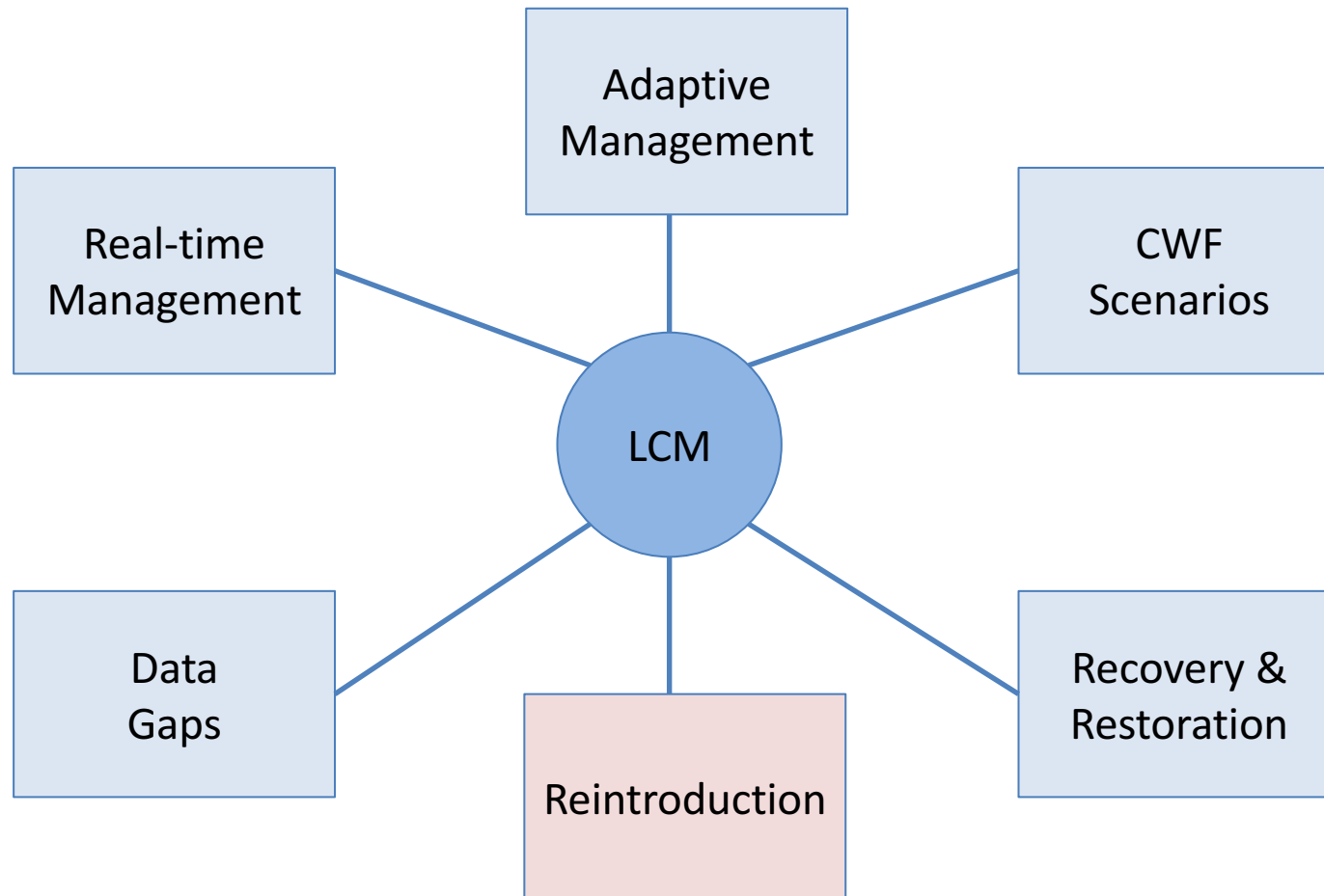
Chippis Island  
abundance

# Evaluate Monitoring

- Use of WRLCM for evaluating sampling design to improve understanding
- WRLCM is capable of conducting quantitative assessments of how much uncertainty in survival or movement rates can be reduced for different levels of sampling effort.

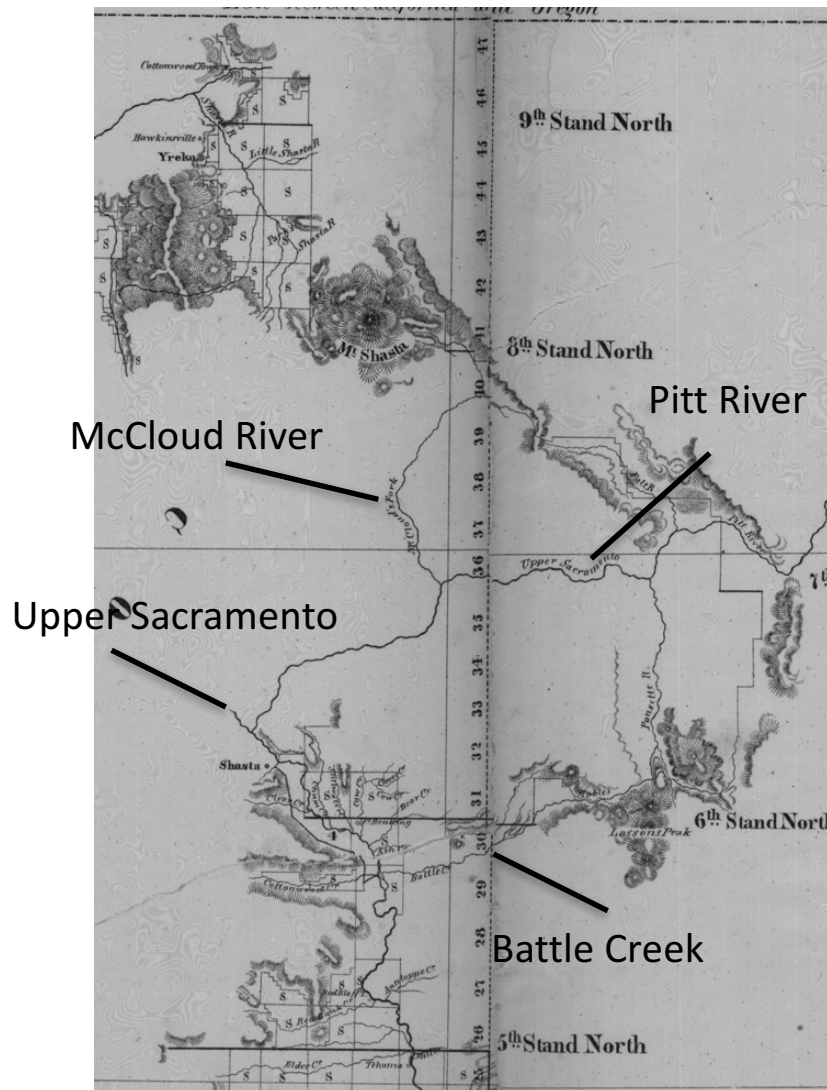


# What types of decisions do we want to address?



# Historical winter-run spawning

- Historically spawning occurred in the Pitt, McCloud, Hat, Fall, Battle Creeks, and Upper Sacramento River
- Permeable basalt and lava supported cool springs with large, stable flows

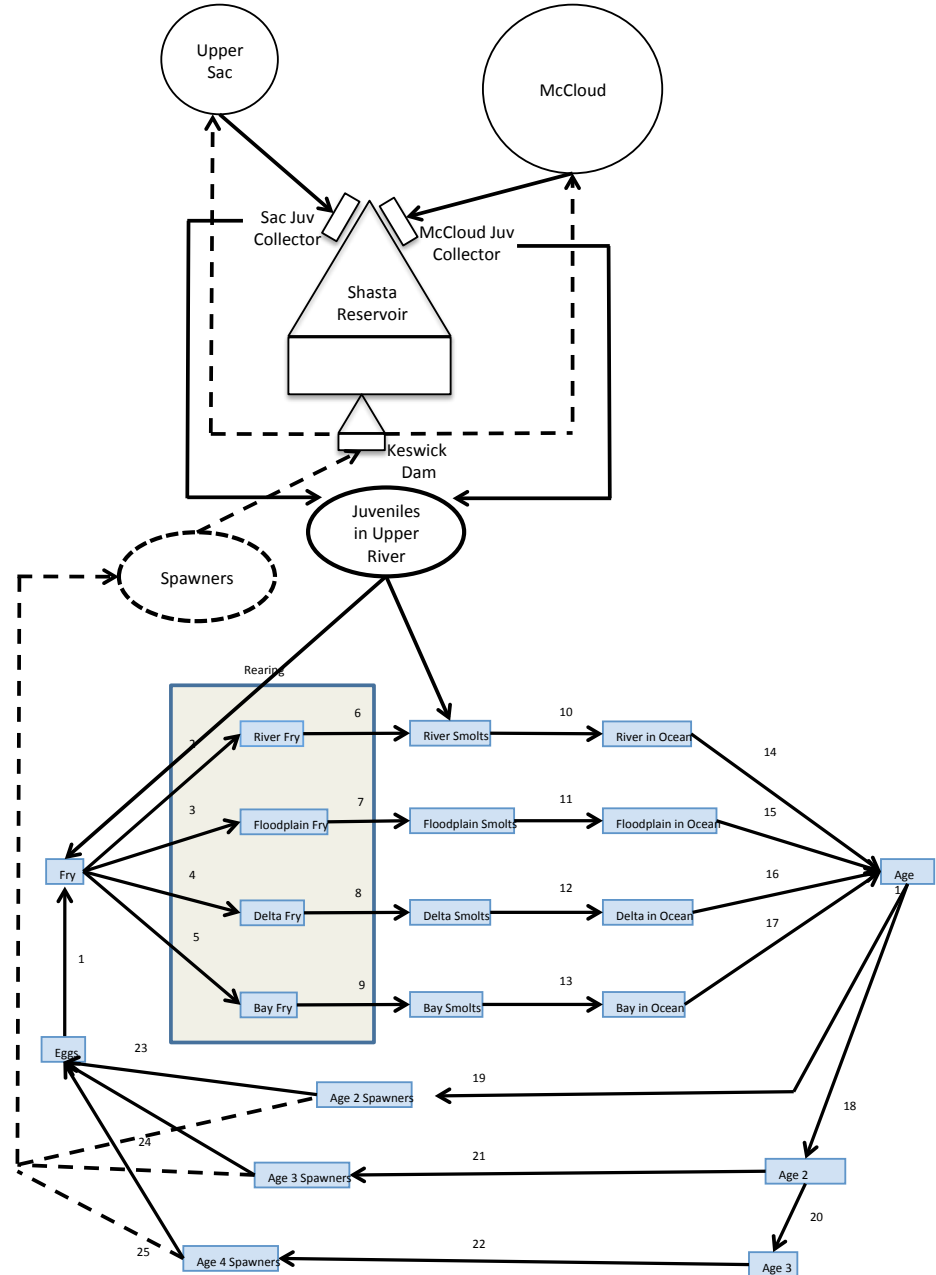


Public survey map in 1856 Williams (2006)

# Reintroduction Model

## Objectives:

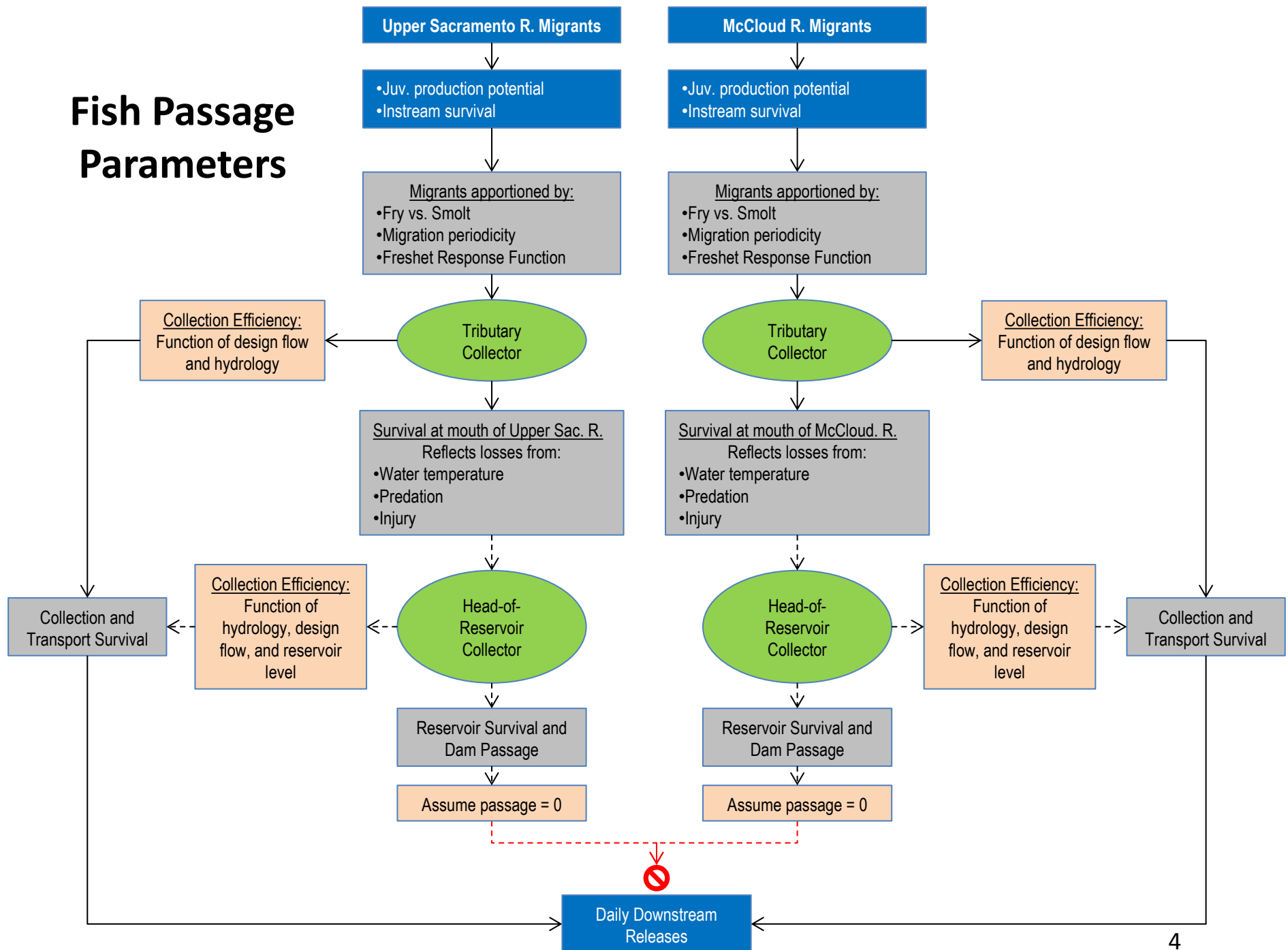
- Link reintroduction to appropriate life cycle stages in the existing life-cycle model
- Develop estimates of fish passage collection efficiency and survival for inclusion in the life cycle model



# Fish Passage Parameters

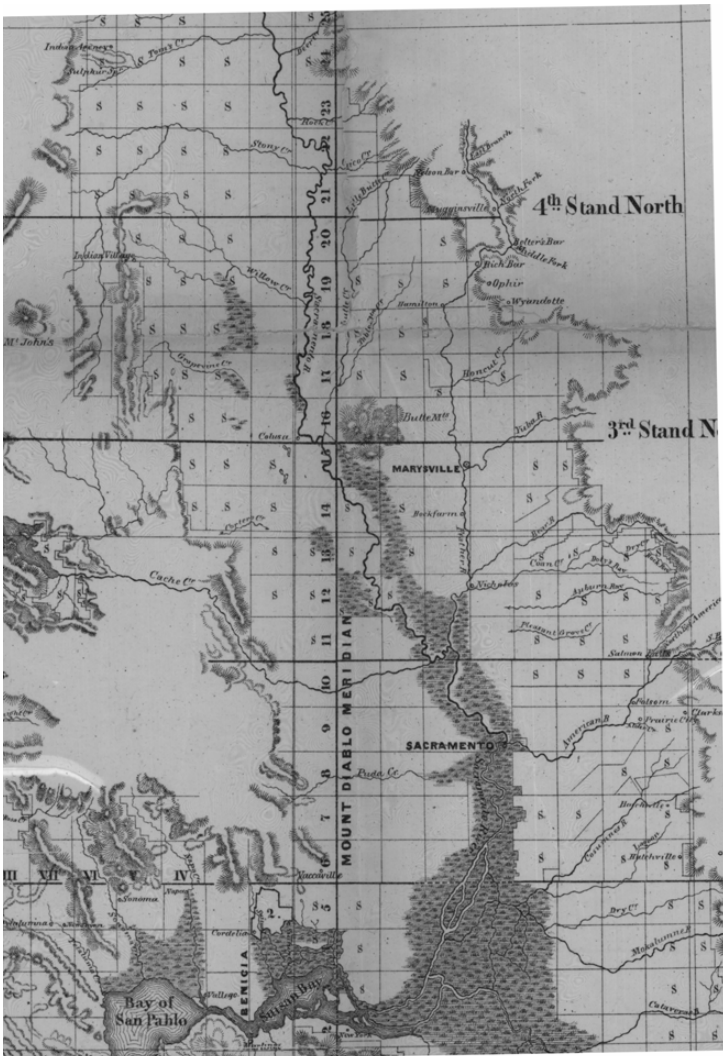
- Upper Sacramento River and McCloud River migrants
- Fry and pre-smolt/smolt periodicity
- Migration influenced by flow, freshets, and temperature
- Tributary Collector and Head-of-Reservoir Collector
- Collection efficiency versus hydraulic capacity of facility
- Estimated survival reflecting predation and water temp
- Upstream and downstream passage
- Integrate factors to estimate Percent Passage

# Fish Passage Parameters





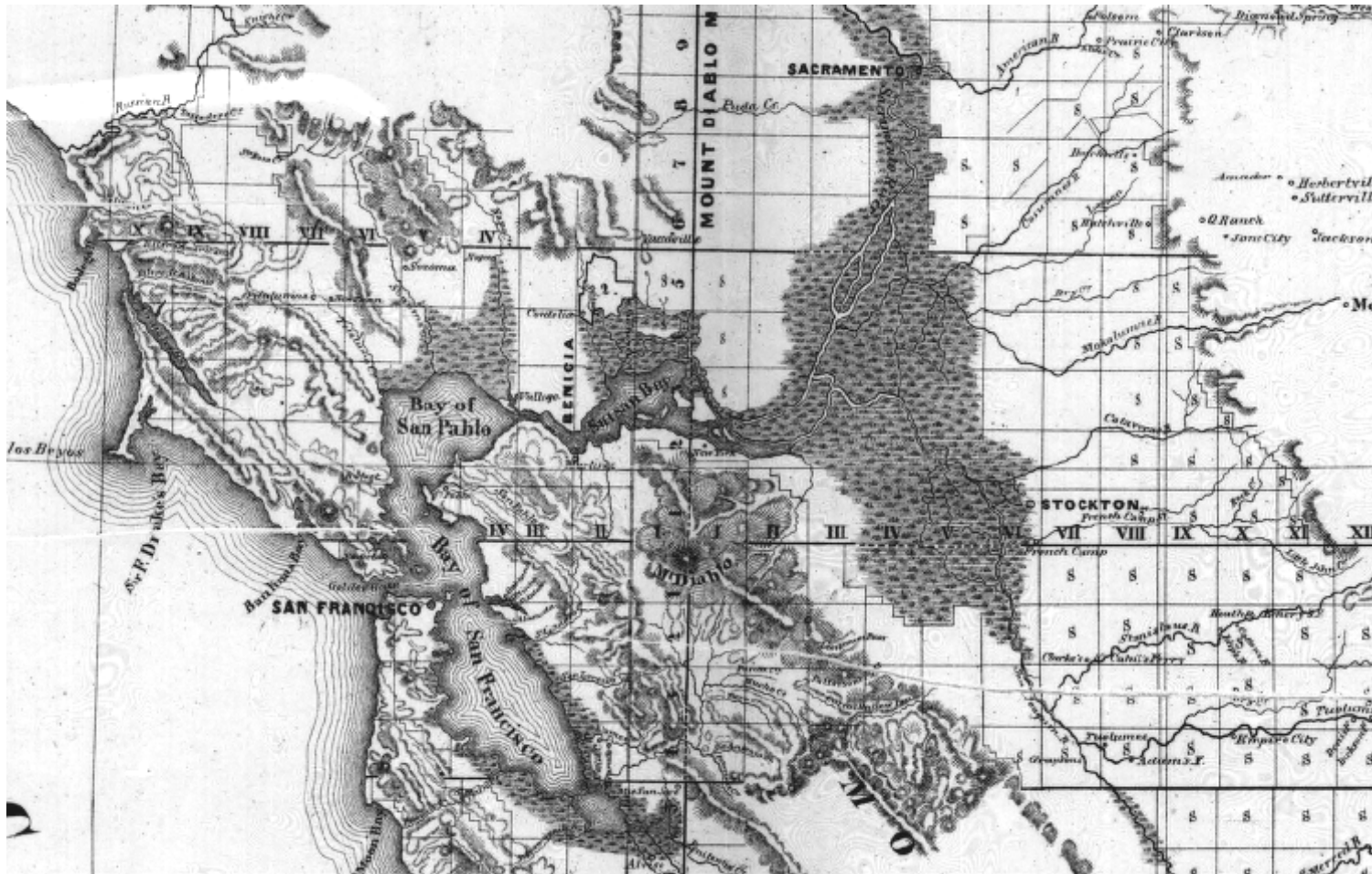
# Sacramento Valley



- Extensive wetlands around Sacramento River and northern delta
- Grids are townships ( $93\text{km}^2$  or  $36\text{mi}^2$ )

Public survey map in 1856 Williams (2006)

# San Francisco Estuary

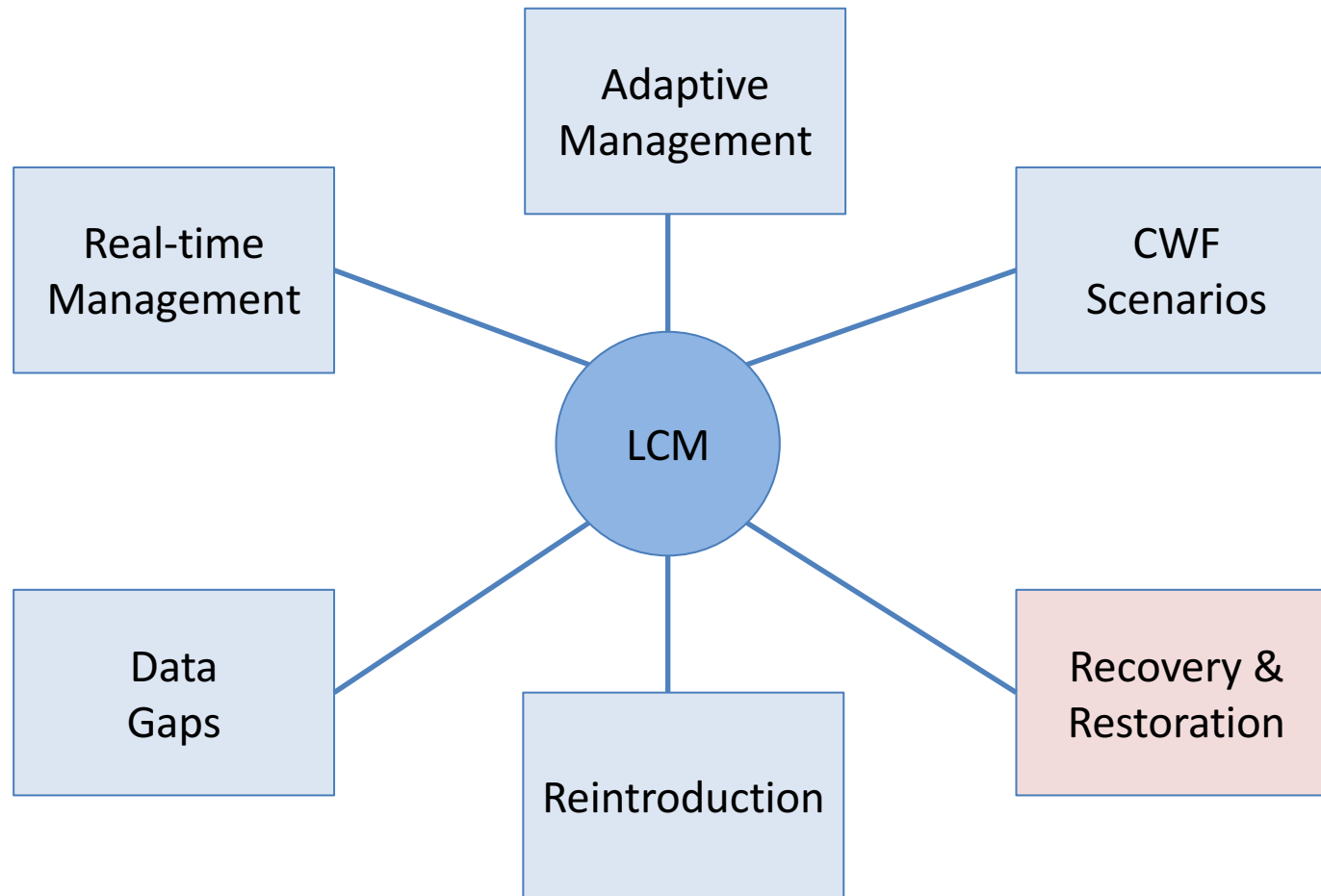


Public survey map in 1856 Williams (2006)

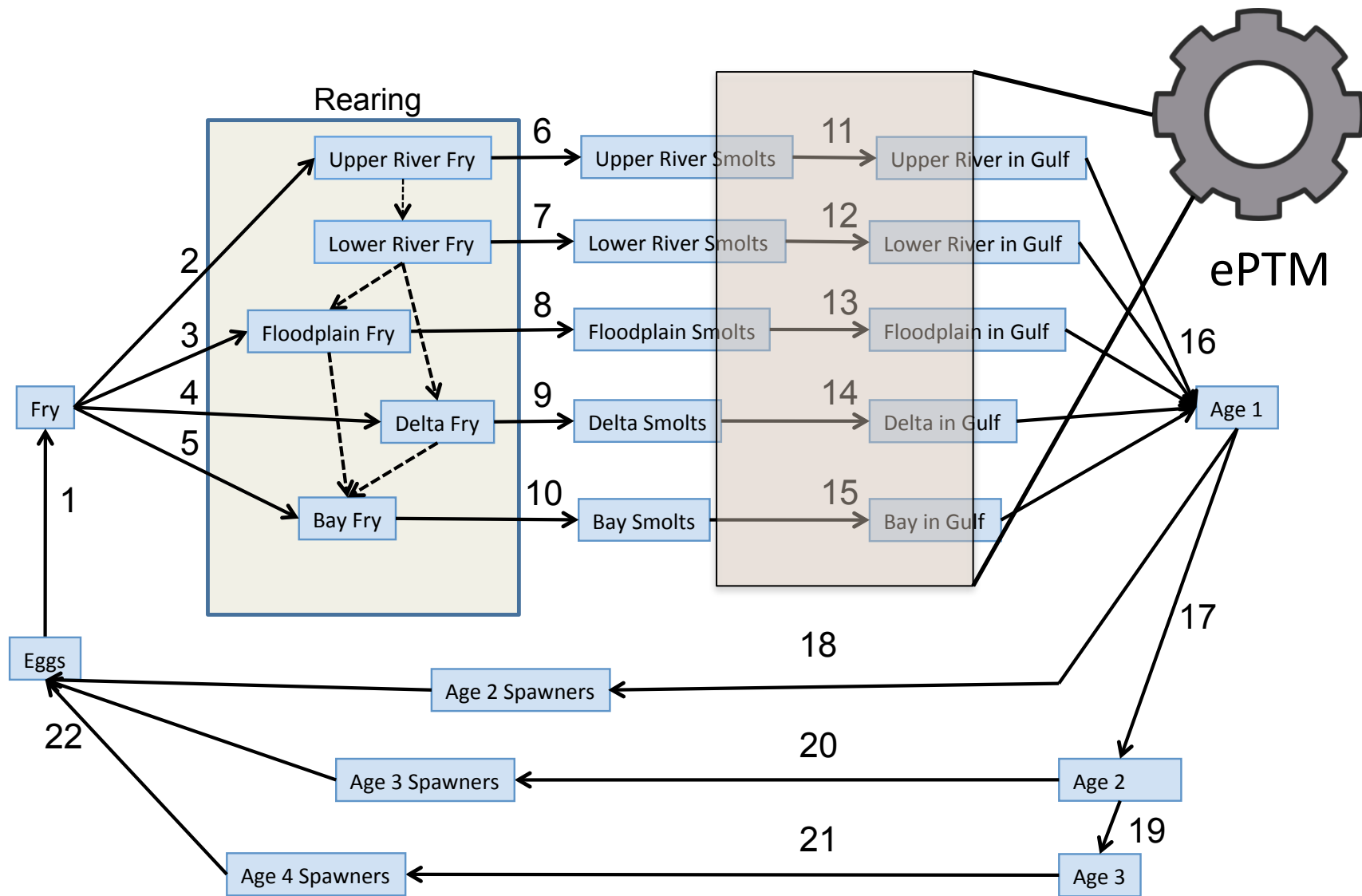
# Multi-population WRLCM

- Reintroduction is a special type of additional population segment requiring capture and transport
  - These can be reparameterized to reflect volitional passage
- Also programmed additional population segments, e.g., Battle Creek, for inclusion into the WRLCM
- Working to use WRCLM to represent an 1860's condition

# What types of decisions do we want to address?



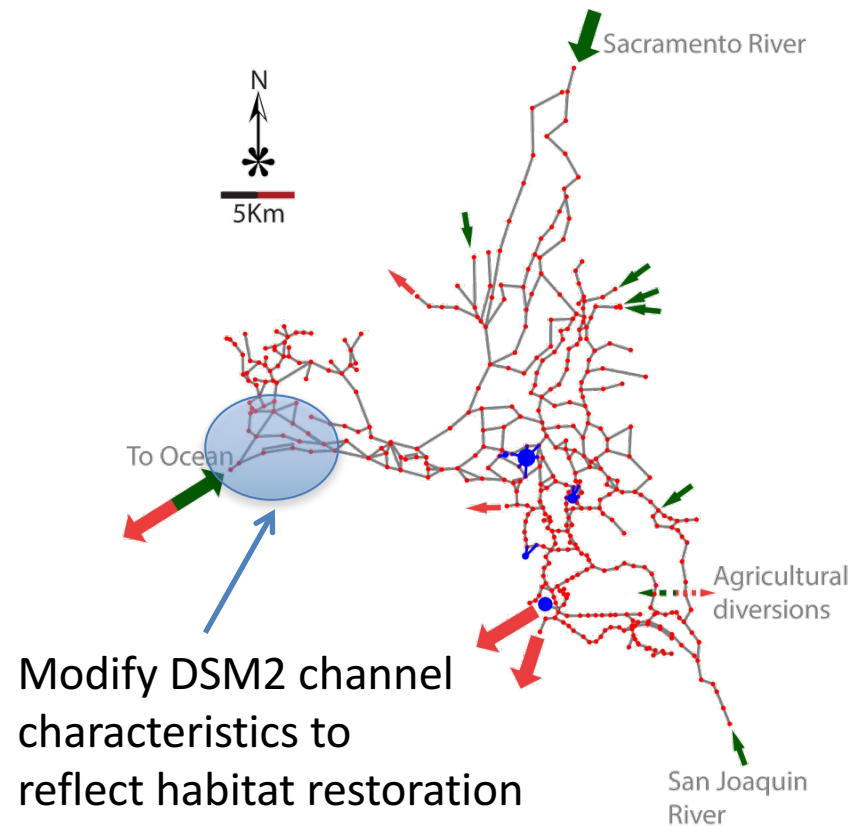
# Coupling LCM with ePTM



# Tidal Restoration Analysis

## Coupled ePTM and LCM modeling

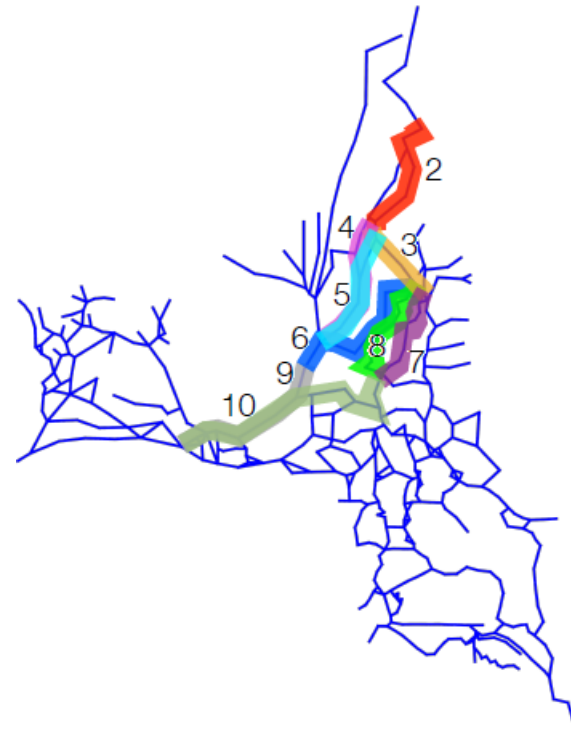
- Evaluate a restoration scenario to reduce tidal amplitude in the delta
- Modify channel characteristics to reflect restoration
- Run ePTM
- Run LCM



# Predator management

## Coupled ePTM and LCM modeling

- Evaluate a scenario to reduce predation rate
- Modify reach-specific predatory density in ePTM
- Run ePTM
- Run WRLCM



Altering the reach-specific survival probability to reflect changes in predator densities

# Next Steps – summer projects

- Calibrate the reintroduction to derive collection and survival performance metrics
- Revisit the estimation methods
  - Objective is forecasting
  - Want to free up some of the fixed parameters
  - Have already developed priors for parameters, so can implement MCMC and variants (MCEM)
- Workshops!



# Thank you!



Credit: Steve Culberson